

A single dose of cocaine rewires the 3D genome structure of midbrain dopamine neurons

Dominik Szabó^{1,2,†}, Vedran Franke^{3,†}, Simona Bianco⁴, Mykhailo Y. Batiuk^{5,§}, Eleanor J. Paul^{6,7,‡}, Alexander Kukalev¹, Ulrich G. Pfisterer^{5,¶}, Ibai Irastorza-Azcarate¹, Andrea M. Chiariello⁴, Samuel Demharter⁵, Luna Zea-Redondo^{1,2}, Jose P. Lopez-Atalaya⁸, Mario Nicodemi^{4,9}, Altuna Akalin³, Konstantin Khodosevich⁵, Mark A. Ungless^{6,7}, Warren Winick-Ng^{1,10,††,*}, Ana Pombo^{1,2,††,*}

¹Max-Delbrück Centre for Molecular Medicine, Berlin Institute for Medical Systems Biology, Epigenetic Regulation and Chromatin Architecture Group, 10115 Berlin, Germany

²Humboldt-Universität zu Berlin, 10117 Berlin, Germany

³Bioinformatics & Omics Data Science platform, Max-Delbrück Centre for Molecular Medicine, Berlin Institute for Medical Systems Biology, 10115 Berlin, Germany

⁴Dipartimento di Fisica, Università di Napoli Federico II, and INFN Napoli, Complesso Universitario di Monte Sant'Angelo, 80126 Naples, Italy

⁵Biotech Research and Innovation Centre, Faculty of Health and Medical Sciences, University of Copenhagen, Copenhagen, DK-2200, Denmark

⁶MRC London Institute of Medical Sciences (LMS), London W12 0HS, UK

⁷Institute of Clinical Sciences (ICS), Faculty of Medicine, Imperial College London, London SW7 2AZ, UK

⁸Instituto de Neurociencias, Universidad Miguel Hernández-Consejo Superior de Investigaciones Científicas (UMH-CSIC), 03550, Sant Joan d'Alacant, Spain

⁹Berlin Institute of Health, 10178 Berlin, Germany

¹⁰Donnelly Centre, University of Toronto, Toronto, Ontario M5S 3E1, Toronto, Canada

† These authors contributed equally to this work

‡ current addresses: Centre for Developmental Neurobiology, Institute of Psychiatry, Psychology and Neuroscience, King's College London, London SE1 1UL, UK. Medical Research Council Centre for Neurodevelopmental Disorders, King's College London, London SE1 1UL, UK

§ current address: Laboratory of Neuroepigenetics, Brain Mind Institute, School of Life Sciences, École Polytechnique Fédérale Lausanne, Lausanne, 1015 Switzerland

¶ current address: Center for Translational Genomics, Lund University, Lund, 221 85 Sweden

†† These authors jointly supervised this work

*Corresponding authors: ana.pombo@mdc-berlin.de; warren.winickng@utoronto.ca

Abstract

1 Midbrain dopamine neurons (DNs) respond to a first exposure to addictive
2 drugs and play key roles in chronic drug usage¹⁻³. As the synaptic and transcriptional
3 changes that follow an acute cocaine exposure are mostly resolved within a few
4 days^{4,5}, the molecular changes that encode the long-term cellular memory of the
5 exposure within DNs remain unknown. To investigate whether a single cocaine
6 exposure induces long-term changes in the 3D genome structure of DNs, we applied
7 Genome Architecture Mapping and single nucleus transcriptomic analyses in the
8 mouse midbrain. We found extensive rewiring of 3D genome architecture at 24 hours
9 past exposure which remains or worsens by 14 days, outlasting transcriptional
10 responses. The cocaine-induced chromatin rewiring occurs at all genomic scales and
11 affects genes with major roles in cocaine-induced synaptic changes. A single cocaine
12 exposure triggers extensive long-lasting changes in chromatin condensation in post-
13 synaptic and post-transcriptional regulatory genes, for example the unfolding of
14 *Rbfox1* which becomes most prominent 14 days post exposure. Finally, structurally
15 remodeled genes are most expressed in a specific DN sub-type characterized by low
16 expression of the dopamine auto-receptor *Drd2*, a key feature of highly cocaine-
17 sensitive cells. These results reveal an important role for long-lasting 3D genome
18 remodelling in the cellular memory of a single cocaine exposure, providing new
19 hypotheses for understanding the inception of drug addiction and 3D genome
20 plasticity.

21

22 **Main**

23 How is an initial exposure to addictive drugs encoded in cellular memory?

24 Dopaminergic neurons (DNs) are critical players in the first response to drug-
25 associated reward learning and reinforcement; a single exposure to cocaine induces
26 long-term potentiation (LTP) of DN synapses in the midbrain ventral tegmental region
27 (VTA), lasting up to 10 days¹. These long-term effects of an initial exposure to
28 addictive drugs, or other LTP activation events, are independent of long-lasting
29 changes in gene expression, which are reported to occur and be resolved within the
30 first 6-24 hours⁴⁻⁷. The first drug exposure is thought to alter the state of DNs, priming
31 them for a much stronger and persistent, memory-associated, LTP induction that
32 occurs after a second or multiple doses⁸, reflecting long-term responses seen in models
33 of addiction learning paradigms⁹. However, without detectable lasting transcriptional
34 or electrophysiological changes, it remains unknown how the cellular memory of a
35 single drug exposure is encoded in DNs.

36

37 Our prior work mapping 3D genome structures in the adult mouse brain
38 showed that addiction genes establish specific chromatin structures in VTA DNs, that
39 are absent in other brain cell types¹⁰. Recent reports show that multiple cocaine
40 exposures alter chromatin organization and the epigenetic state of addiction loci in
41 brain regions involved in secondary cocaine-responses and which receive input from
42 VTA DNs^{11,12}. Altered chromatin looping has also been reported *in vitro*, after chronic
43 pharmacological activation of glutamate neurons for 1 day, at immediate-early genes
44 (IEGs)¹³. Regardless of all current efforts to understand the onset of addiction¹⁴, it
45 remains unknown whether a single exposure to an addictive drug is sufficient to induce
46 changes in chromatin structure *in vivo* in VTA DNs, whether and which chromatin
47 changes are long lasting, and which genes are affected. In this study, we show that the

48 3D genome structure of VTA DNs is extensively rewired 24 hours after a single
49 exposure to cocaine, with structural changes that can last or become more extensive
50 after 14 days, a time-frame that is well beyond the resolution of transient
51 transcriptional^{4,5} and LTP-associated¹ effects. Our work implicates the remodelling of
52 3D genome structure as a mechanism for the cellular memory of a first drug exposure
53 and as a basis for the onset of addiction, and identifies susceptible genes.

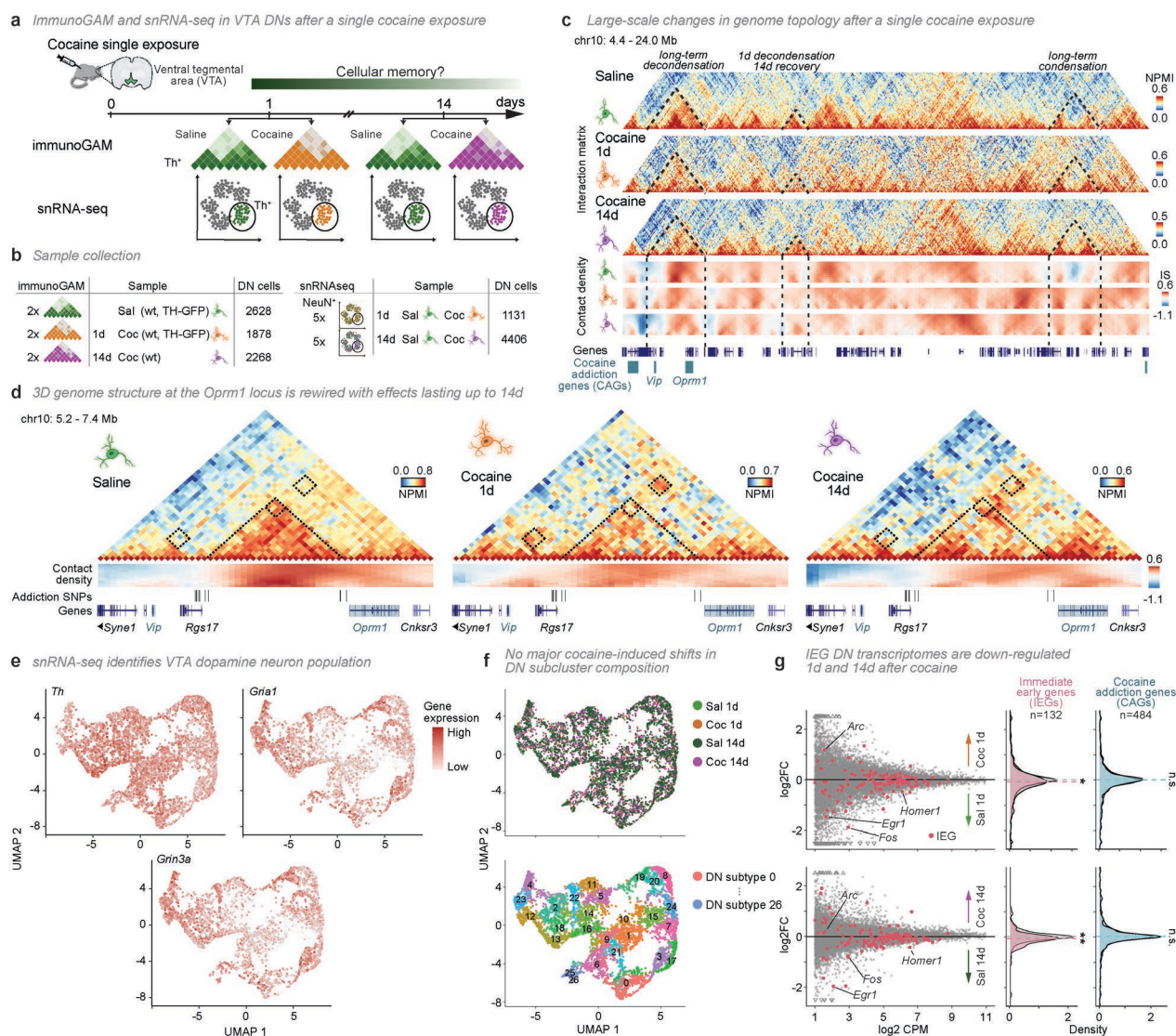
54

55 **Mapping the 3D genome structure and transcriptome of midbrain dopamine** 56 **neurons upon a single cocaine exposure**

57 To study the short- and long-term effects of a single exposure to cocaine on 3D
58 genome structure and gene expression, we injected mice with either cocaine (15
59 mg/kg)^{1,15} or saline, and isolated DNs from the midbrain VTA after 1 or 14 days (in
60 total 26 adult mice; **Fig. 1a**). We chose 1 day post-exposure to identify rewired 3D
61 genomic structures that would persist beyond the timeframe of previously reported
62 transcriptional changes^{4,5}, and also analyzed changes at 14 days to discover long-
63 lasting effects well past reported LTP responses^{1,16}.

64

65 To map 3D genome structure while avoiding tissue dissociation, we applied
66 Genome Architecture Mapping with immunoselection (immunoGAM) to DNs in VTA
67 samples, using tyrosine hydroxylase immunodetection as a marker. We collected
68 immuno-GAM data from 4 cocaine-treated and 2 saline-treated animals, the latter
69 datasets previously reported in Winick-Ng *et al.* 2021¹⁰. The GAM samples were
70 produced from a total of 6774 DNs (4146 cocaine-treated and 2628 saline-treated; **Fig.**
71 **1b**, see **Extended Data Fig. 1a-d** for quality control metrics).



72

73 **Figure 1. A single cocaine exposure induces large-scale disruption of 3D genome**
 74 **structure.**

75 **a**, 3D genome structure (immunoGAM) and single transcriptomes (single-nucleus RNA
 76 sequencing) in mouse dopamine neurons (DNs) from the ventral tegmental area (VTA), 1 or
 77 14 days following single cocaine or saline exposure. **b**, Number of replicates (animals) and
 78 cells profiled. **c**, Example of long-term cocaine-induced 3D genome reorganization (chr10: 4.4
 79 – 24.0 Mb; 40 kb resolution). NPML, normalized pointwise mutual information. Contact
 80 density heatmaps represent insulation scores calculated with square boxes ranging 240-1040
 81 kb (bottom to top, respectively). **d**, Cocaine-induced disruption of a domain demarcated by
 82 putative addiction single-nucleotide polymorphisms (SNPs) leads to long-term rewiring of
 83 flanking addiction-associated genes (chr10: 5.2 – 7.4 Mb). **e**, Representative Uniform
 84 Manifold Approximation and Projection (UMAP) expression profiles of DN for a marker
 85 gene (*Th*) and other neuronal genes (*Gria1* and *Grin3a*). **f**, Projected distribution of cells
 86 according to treatment and DN subtype. **g**, Fold change representing differential gene
 87 expression 1- or 14-days following cocaine. No significant transcriptional differences of
 88 individual genes are detected 1- or 14-days following cocaine exposure, compared to saline
 89 treatment. Immediate early genes (IEGs) are highlighted in pink. The expression of IEGs,
 90 considered as a group, is downregulated 1 and 14 days after cocaine (two-sided Wilcoxon
 91 signed-rank test, $P = 1.6 \times 10^{-2}$ and 4.8×10^{-3} , respectively; n.s., not significant). CAGs,
 92 Cocaine addiction genes.

93

94 To characterise gene expression, we profiled single nuclear transcriptomes in
95 the same conditions and time points. We collected VTAs from 20 wildtype mouse
96 littermates, 1 or 14 days following treatment with saline or cocaine (**Fig. 1b**), and
97 applied single nucleus RNA-seq (snRNA-seq)¹⁷ to neurons positive for the neuronal
98 marker NeuN (**Extended Data Fig. 1e**), collecting high quality transcriptomes of
99 115,211 nuclei (see **Extended Data Fig. 1f-i** for quality control metrics)¹⁸.

100

101 **A single exposure to cocaine induces large-scale changes in DN chromatin** 102 **topology**

103 Inspection of chromatin contact matrices revealed many events of striking
104 reorganization of 3D genome structure, at multiple genomic scales, upon cocaine
105 exposure. For example, a representative 20 Mb region on chromosome 10 displays
106 marked differences in chromatin contacts both at 1 and 14 days following cocaine
107 exposure compared with saline injection (**Fig. 1c**, see **Extended Data Fig. 2a, b** for
108 wildtype replicates and TH-GFP genotype). To assess whether genes previously
109 associated with chronic cocaine exposure were amongst those affected by the
110 extensive topological changes observed, we compiled a list of cocaine-associated
111 genes (CAGs) from publicly available resources (**Supplementary Table 1**)^{19,20}. At 1-
112 day post-exposure, contact matrices show extensive losses and gains of contacts at
113 both short and long genomic ranges with clear disruption of self-interacting
114 topologically associating domains (TADs). By 14 days, remarkably, long-lasting
115 differences in chromatin topology are evident, including at regions overlapping CAGs,
116 such as *Vip*, involved in both neurotransmission and neuromodulation, and *Oprm1*, an
117 opioid receptor gene (**Fig. 1c**). Some regions revert to their pre-cocaine state, while
118 others show new structural alterations not present at 1 day.

119 To assess differences in contact density at different local scales, we measured
120 insulation scores (average contact density) at genomic distances ranging 240 to 1040
121 kb, in saline, 1- and 14-day matrices^{10,21} (**Fig. 1c**, lower contact density panels). In
122 some genomic regions, extensive decondensation seen 1-day post exposure reverts to
123 pre-cocaine states by 14 days, while in many other regions, chromatin decondensation
124 or condensation lasts or becomes more prominent by 14 days.

125
126 One exemplar locus with strong cocaine-induced reorganization contains the
127 addiction genes *Oprm1* and *Vip*, separated by a large domain which is flanked by
128 multiple putative conserved single nucleotide polymorphisms (SNPs) associated with
129 cocaine and other comorbid addictions (**Fig. 1d**, see **Extended Data Fig. 2c, d** for
130 replicates)^{22,23}. The SNP list was compiled from publicly available resources and
131 curated for human-mouse conservation (**Supplementary Table 1**)^{19,24}. Cocaine
132 exposure results in increased contacts between *Rgs17*, a modulator of the G-protein
133 coupled receptor signaling pathway²⁵, and *Cnksr3* or *Vip* after 1 day, which recovers
134 after 14 days. In contrast, contacts between *Rgs17* and *Oprm1* are disrupted after 1
135 day, and do not recover even by 14 days. These observations show that a single
136 exposure to cocaine results in changes in 3D genome topology that outlast
137 transcriptional and synaptic effects, which occur throughout the genome including at
138 genomic regions that contain addiction genes and non-coding addiction-associated
139 SNPs.

140
141 To characterize gene expression genome-wide in VTA DNs treated in the same
142 conditions, we selected a total of 5,537 DNs selected from VTA snRNA-seq
143 transcriptomes using the marker genes *Th*, *Slc6a3*, *Slc18a2*, *Lmx1b*, *Foxa2*, *Nr4a2*,
144 *Snca* and *Kcnj6* (**Extended Data Fig. 3a-i**)²⁶. We confirmed DN identity by uniform

145 expression of *Th*, which encodes tyrosine hydroxylase (**Fig. 1e**). Genes with synaptic
146 plasticity-related functions, which are involved in cocaine-induced LTP¹, were also
147 highly expressed, such as *Gria1*, encoding an AMPA receptor subunit, or the NMDA
148 receptor subunit *Grin3a* (**Fig. 1e**), while low expression of the cocaine response gene
149 *Cartpt*¹² indicated the DNs are not undergoing an active cocaine response (**Extended**
150 **Data Fig. 3j**). We also find that the overall DN cluster substructure is not affected by
151 cocaine exposure, and can be classified into 27 sub-populations, similar to recent DN
152 subtype classifications²⁷ (**Fig. 1f, Extended Data Fig. 3k, Supplementary Table 2**).
153 We find that no individual gene is significantly differentially expressed 1 or 14 days
154 following cocaine exposure, compared to saline treatment (**Supplementary Table 3**),
155 in line with previous transcriptomic analyses performed 1 day after *in vivo* exposure to
156 cocaine⁹. To search for more subtle long-term transcriptional changes, we considered
157 the group of immediate early genes (IEGs), known to be upregulated within the first
158 hours following neuronal activation after cocaine exposure⁹. We find a tendency for
159 downregulation of IEGs at both 1 and 14 days, such as *Fos*, *Nr4a1* and *Homer1*,
160 whereas CAGs, NMDA receptor (NMDAR) and AMPA receptor (AMPA) genes are
161 not affected (**Fig. 1g, Extended Data Fig. 3l-o**). These results suggest that a single
162 cocaine exposure may result in a homeostatic response that overcompensates for the
163 initial strong, cocaine-induced activation²⁸.

164

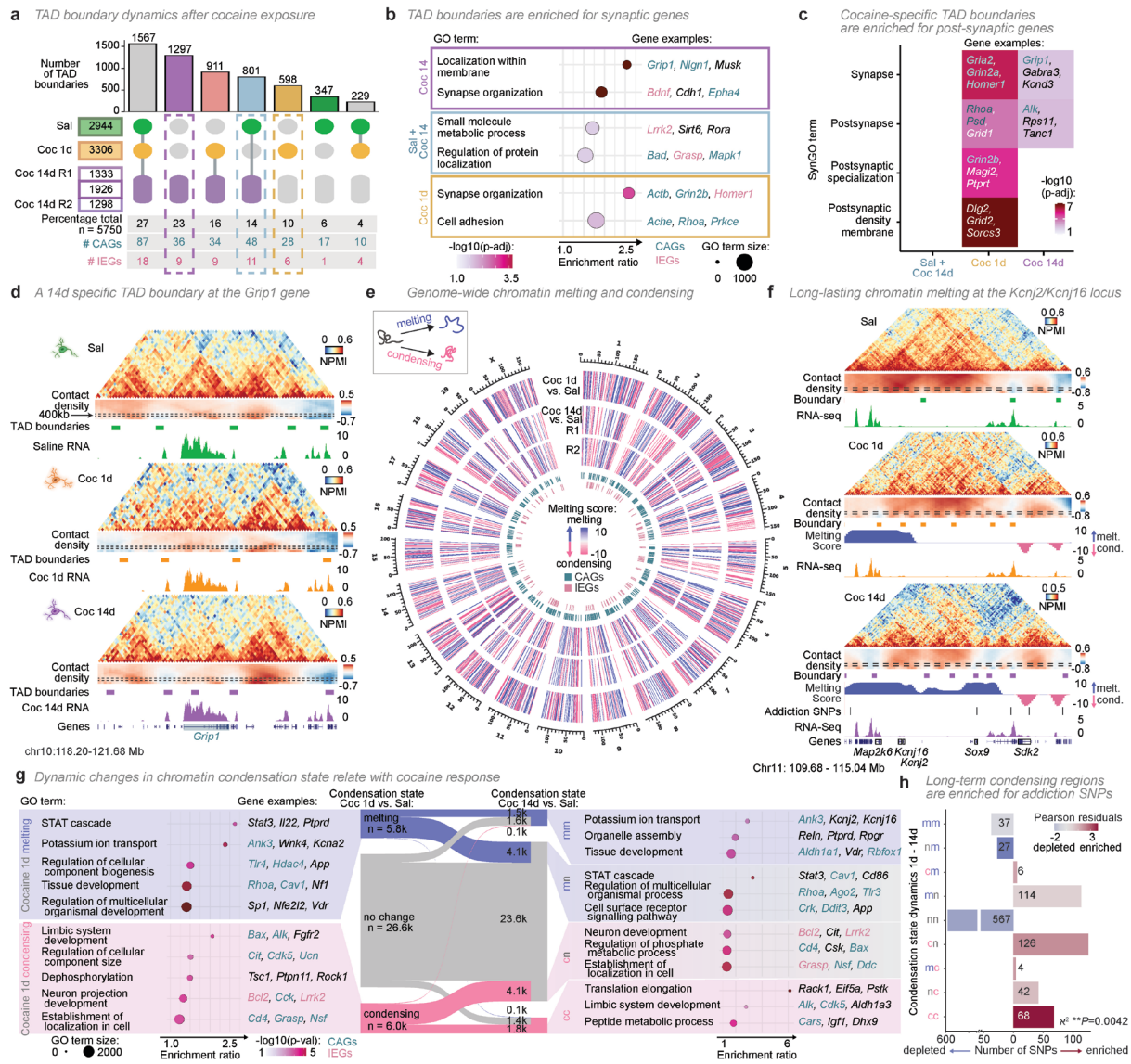
165 **Cocaine exposure induces new TAD boundaries at postsynaptic genes**

166 To investigate the extent of cocaine-induced large-scale changes in 3D genome
167 structure and the affected genes, we started by comparing the organization of
168 topologically associating domains (TAD)^{10,21,29}. Cocaine exposure led to extensive
169 genome-wide reorganization of TADs, with only 27% remaining unaffected by
170 cocaine exposure, 49% appearing *de-novo* after cocaine exposure, 14% lost at 1 day

171 but recovered at 14 days, and finally 10% lost and not recovered by 14 days (**Fig. 2a**).
172 Remarkably, cocaine-induced TAD boundaries overlap with many neuronal genes,
173 including IEGs (e.g. *Homer1*) as well as cocaine addiction genes (e.g. *Grin2b*, *Actb*,
174 *Nlgn1*)³⁰⁻³² (**Supplementary Table 4**), suggesting that the immediate transcriptional
175 response to cocaine exposure leads to long-term domain reorganization that affects
176 IEG responsive genes and cocaine addiction genes. We find that boundaries uniquely
177 identified 1 or 14 days after cocaine exposure appear at neuronal-relevant genes,
178 including the IEG *Bdnf*, or CAGs such as *Epha4*, *Grip1* and *Nlgn1*, and are
179 characterized by gene ontologies (GOs) such as ‘synapse organization’ (e.g. *Lrk2* or
180 *Bdnf*, respectively), ‘cell adhesion’ (at 1 day; e.g. *Ache*) or ‘localization within
181 membrane’ (at 14 days; e.g. *Grip1*; **Fig. 2b, Extended Data Fig. 4a**).

182

183 Next, we applied SynGO (Synaptic Gene Ontology) enrichment analyses and
184 found that TAD boundaries which are unique to cocaine exposure at 1 or 14 days were
185 especially enriched for specialized postsynaptic functions (**Fig. 2c, Extended Data**
186 **Fig. 4b**)³³. Postsynaptic plasticity at glutamatergic synapses are largely responsible for
187 the LTP effects observed after a single cocaine exposure^{1,34}. For example, the TAD
188 containing *Grip1*, a scaffolding protein gene critical for AMPAR trafficking during
189 LTP³⁵, is largely disrupted 1 day post-cocaine exposure, even though the flanking
190 TAD borders remain stable (**Fig. 2d, Extended Data Fig. 4c, d**). By 14 days post-
191 exposure, contacts are recovered only downstream of the first *Grip1* intron,
192 establishing a smaller TAD and a new TAD boundary inside *Grip1*, while the first
193 exon and intron remain highly decondensed. Together, these results show complex loss
194 and gain of TAD boundaries, 1- and 14-days following cocaine exposure, which affect
195 genes with synaptic functions and known roles in the cocaine-induced plasticity
196 response, with potential long-term consequences for gene activity.



197

198 Figure 2. TAD borders and contact density are extensively rewired following a single 199 cocaine exposure.

200 **a**, UpSet plot of multi-way TAD boundary comparisons, considering 14-day boundaries found
201 in either biological replicate. Sal, saline; Coc 1d, 1 day after cocaine; Coc 14d, 14 days after
202 cocaine. **b**, Cocaine-response genes overlap cocaine-specific TAD boundaries. **c**, Genes
203 overlapping cocaine-induced TAD boundaries have postsynaptic functions (synaptic gene
204 ontology analysis; SynGO). **d**, *Grip1* overlaps a 14-day specific boundary (coloured boxes
205 below contact density heatmap; chr10: 118 – 122 Mb). Dashed boxes on the contact density
206 heatmap represent 400kb insulation scores, used to determine boundaries. Replicate 1 is shown
207 for 14 days. **e**, Genome-wide melting and condensing, computed across a 120 kb sliding
208 window, based on melting scores >5 or <-5, respectively (one-sided Kolmogorov–Smirnov
209 test, $P < 1 \times 10^{-5}$). **f**, Example region showing melting of *Kcnj16* and *Kcnj2*, and condensing
210 downstream of *Sox9*, at 1- and 14-days post-cocaine (chr11: 110 - 115 Mb). **g**, Melting and
211 condensing dynamics following cocaine exposure, considering only events common to both
212 14- day replicates. **h**, Addiction-associated SNPs are enriched in condensing regions (χ^2
213 distribution test, $**P = 0.0042$). In **b** and **g**, top gene ontology (GO) terms were selected by
214 adjusted P -value (p-adj) and enrichment ratio (observed over expected ratio of expressed
215 genes).
216

217 **Widespread changes in chromatin condensation upon cocaine exposure**

218 Next, to quantify the broad changes in chromatin compaction genome-wide, we
219 developed MELTRONIC (genomIC MELTRON), an approach based on the
220 MELTRON pipeline which we previously developed to detect melting at long genes¹⁰.
221 MELTRONIC quantifies gain (condensation) or loss (melting) of contacts genome-
222 wide by applying a sliding window of differential insulation scores across the genome.
223 Using insulation boxes from 240 to 1040 kb, and a sliding window of 120kb,
224 MELTRONIC detected chromatin melting and condensation on all chromosomes at
225 both 1 and 14 days in comparison with saline (**Fig. 2e, Extended Data Fig. 5a, b,**
226 **Supplementary Table 5**). Condensing and melting regions were defined using
227 conservative melting score thresholds of -5/5 (equivalent to an adjusted $P < 1 \times 10^{-5}$),
228 in line with previous work¹⁰ (**Extended Data Fig. 5c, d**). Melting and condensing
229 events are stronger at 1 compared to 14 days after cocaine exposure, but many
230 genomic regions remain or become *de-novo* melted or decondensed by 14 days. The
231 prevalence of melting and condensing states at 14-days post exposure are confirmed by
232 separate analyses of the two biological replicates, which showed high conservation
233 (61.6%, **Extended Data Fig. 5e**).

234

235 Genomic regions affected by long-term changes in chromatin compaction after
236 cocaine exposure include the genomic regions containing the *Kcnj2* and *Kcnj16* locus,
237 two potassium ion channel genes that modulate LTP sensitivity³⁶, as well as several
238 addiction-associated SNPs (**Fig. 2f, Extended Data Fig. 5f, g**). The region also
239 contains *Sox9*, a neural stem cell fate gene, which has been extensively studied in the
240 context of genetic rearrangements that alter 3D genome topology and gene expression,
241 leading to human developmental diseases^{37,38}. We show that a single exposure to
242 cocaine results in the loss of the TAD boundary separating *Kcnj2/16* from *Sox9* and its

243 enhancers by 1 day post exposure, coinciding with melting events upstream of
244 *Kcnj2/16*, across a large 1.5 Mb genomic region that also contains *Map2k6*, a mitogen-
245 activated protein kinase gene, and other highly expressed genes. By 14 days,
246 chromatin melting extends downstream of *Kcnj2/16*, across the region surrounding the
247 *Sox9* locus. Long-term condensation events are also observed in the same region and
248 affect for example *Sdk2*, a paralog of *Sdk1* which is upregulated after chronic cocaine
249 use in the Nucleus accumbens (NAc)³⁹. These long-lasting chromatin compaction
250 changes suggest the long-term cocaine-induced propagation of melting and
251 condensation of genes related to neuronal activity, including at many SNP containing
252 regions.

253

254 Next, we performed GO analyses to explore which genes are affected by the
255 different dynamics of melting/condensing at 1- and 14-days post cocaine exposure
256 (**Fig. 2g**). For example, 1-day melted regions contain genes with functions in the
257 STAT cascade and potassium ion transport, with the latter typically remaining melted
258 at 14 days. Condensing regions at 1-day post exposure are enriched for genes
259 associated with neuron projection development and limbic system development, with
260 the latter remaining condensed at 14 days. SynGO enrichment analyses identify genes
261 with roles in synaptic organisation enriched in 1-day melting regions and in 14-day
262 condensing regions (**Extended Data Fig. 5h**). For example, the receptor tyrosine
263 kinase *Alk*, which concentrates in post-synaptic domains and contains multiple
264 addiction-associated SNPs in its intronic regions⁴⁰, condenses at 1 day and remains
265 condensed at 14 days (**Extended Data Fig. 5i, j**). Interestingly, 1- and 14-days
266 condensing regions are also significantly enriched in addiction-associated SNPs ($P =$
267 0.0042, Chi-squared test; **Fig. 2h**). Taken together, long-term chromatin melting and
268 condensing are widespread cocaine-associated phenomena that affect a significant

269 fraction of the genome, occurring both at coding regions of genes with important
270 transcriptional and synaptic functions, and at non-coding regions with regulatory or
271 structural roles.

272

273 **Long neuronal genes undergo cocaine-induced melting and condensing events**

274 Long genes are more highly expressed in terminally differentiated cells,
275 including neurons, where their melting state reflects their expression levels in specific
276 neuronal cell-types^{10,42-44}. To quantify the effects of cocaine exposure on the folding of
277 long genes, here longer than 280 kb, we applied MELTRON¹⁰ and found that
278 approximately half undergo melting or condensing events at 1 day post-cocaine
279 exposure (140 out of 291 genes; **Fig. 3a, Supplementary Table 5**). Amongst these
280 genes, 73 retain their melted/condensed state at 14 days, while an additional 46 genes
281 melt or condense *de novo* (19 and 27 genes, respectively). Of interest, many of the
282 genes that undergo cocaine-induced melting in DNPs were previously found melted in
283 pyramidal glutamatergic neurons (PGNs; e.g. *Rbfox1*)¹⁰, suggesting that cocaine alters
284 the cell-type specificity of chromatin condensation.

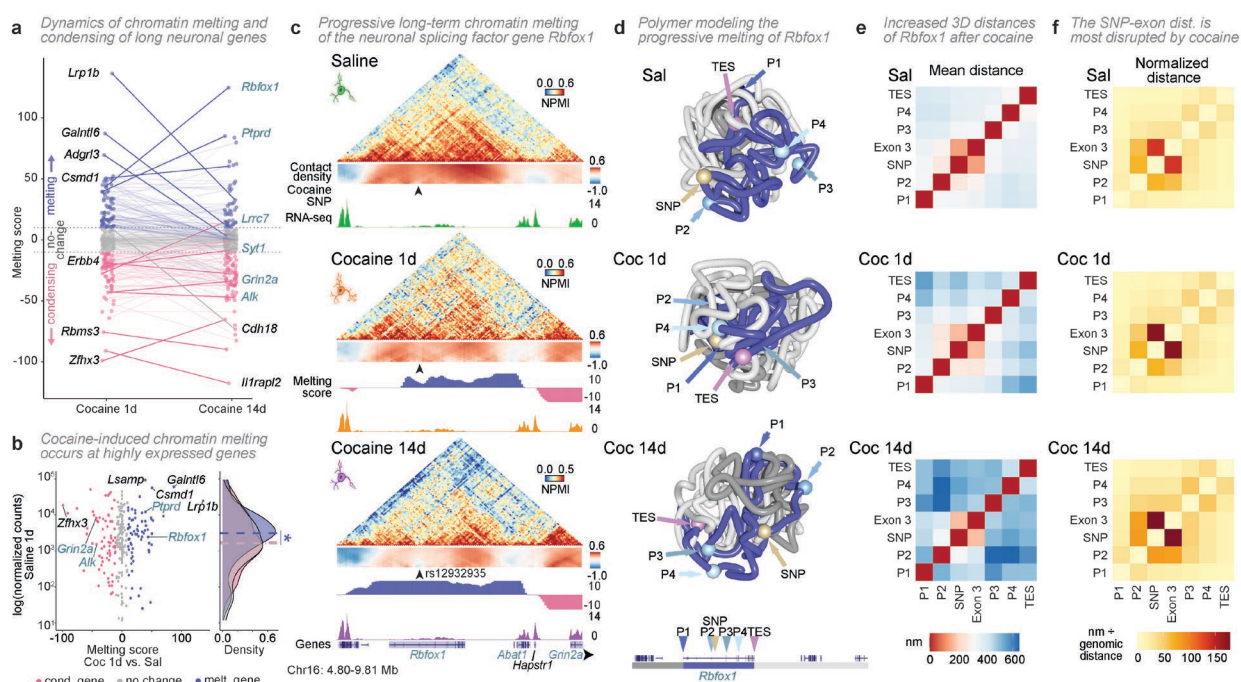
285 Long genes that are melted 1-day post-cocaine exposure tend to be more highly
286 transcribed in saline-treated cells compared to genes that condensed or are unchanged,
287 suggesting that higher transcription rates sensitize genes to larger scale melting events
288 (**Fig. 3b**). By 14 days post exposure, the melting status is much less related with gene
289 expression in saline treated cells (**Extended Data Fig. 6a**) and is possibly a bystander
290 consequence of the initial direct effects of cocaine-induced transcriptional activation
291 on chromatin topology.

292

293 **The *Rbfox1* gene melts extensively 14 days after cocaine exposure**

294 To explore further the long-term effects of cocaine exposure on chromatin
 295 folding, we focused on *Rbfox1*, a cocaine addiction gene which regulates alternative
 296 splicing following multiple cocaine treatments in the NAc⁴⁵, and is the most melted
 297 gene at 14 days post cocaine exposure. In saline-treated DNAs, *Rbfox1* is contained
 298 within two large chromatin domains with many inter-TAD interactions (**Fig. 3c**,
 299 **Extended Data Fig. 6b** for a comparison of the two 14-day replicates). At 1 day after
 300 cocaine exposure, *Rbfox1* is extensively decondensed (melting score = 43), especially
 301 in its 3' end. By 14 days, its melting score increases further (to 125), especially at an
 302 intronic region containing a putative cocaine-associated SNP (rs12932935). The SNP
 303 coincides with putative transcription factor (TF) binding sites for IEGs, including *Jun*
 304 and *Stat1*, as well as the circadian factor *Nr1d2* (**Extended Data Fig. 6c**), suggesting
 305 that LTP-induced TF activity may be targeted at, or involved in, the long-term
 306 structural reorganization of chromatin after a single cocaine exposure.

307



308

309 **Figure 3. *Rbfox1* melting is more pronounced 14 days after cocaine exposure.**
 310 **a**, Melting scores from long (> 280kb) expressed genes, 1 or 14 days following cocaine.

311 **b**, Melting at 1 day of cocaine is associated with higher baseline transcription (two-sided
312 Wilcoxon signed-rank test, $*P = 0.02$). Expression is shown for the matching samples
313 collected 1-day after injection with saline. **c**, Example region showing melting of *Rbfox1*, 1
314 and 14 days after cocaine (chr16: 4.8 - 9.8 Mb). Arrowhead indicates a putative cocaine SNP.
315 **d**, Polymer models of the *Rbfox1* region show looping near the transcription end site (TES) at
316 1 day, and full gene decondensation by 14 days. Colour bars, gene region, up- and downstream
317 flanking regions. Coloured spheres and arrowheads, positions of promoters and SNP. Cocaine-
318 induced increased 3D spatial separation of promoters and SNP **e**, especially between the SNP
319 and downstream exon after normalization of linear genomic distances **f**.

321 To further understand the cocaine-induced structural changes in the *Rbfox1*
322 locus, we generated ensembles of 3D models (1100 models per condition), using a
323 polymer-physics based approach^{10,46} which were validated by reconstructing *in-silico*
324 GAM matrices (**Extended Data Fig. 6d**). Inspection of single models shows that
325 different sections of the *Rbfox1* gene are more tightly compacted in saline, with
326 proximal positioning of several *Rbfox1* promoters and its TES (**Fig. 3d**; see more
327 examples in **Extended Data Fig. 6e, Supplementary Videos 1-6**). At 1-day post-
328 exposure, the genomic region between the promoter 4 and TES of *Rbfox1* loops out
329 from the rest of the polymer (**Supplementary Videos 3 and 4**). By 14 days, the entire
330 *Rbfox1* gene becomes highly extended, with a larger separation between all its
331 promoters, the cocaine SNP, and the TES. The cocaine-induced increased separation
332 between promoters and SNP, especially at 14 days, are confirmed across the ensemble
333 of polymers (**Fig. 3e, Extended Data Fig. 6f, g**). Variance analyses showed that these
334 internal distances are most highly variable across polymers after 14 days (**Extended**
335 **Data Fig. 6g**), indicating that the single exposure to cocaine results in loss of structural
336 coherence in the 3D organization of *Rbfox1*. After normalizing for linear distances, we
337 found that the most pronounced increases in physical distance upon cocaine exposure
338 are between the SNP, its closest exon, the upstream internal promoter P2 and to a
339 smaller extent P3 (**Fig. 3f**). This suggests that the post-cocaine structure of *Rbfox1* may
340 sensitize it to future activation, in particular at some of its internal promoters, and

341 highlights a potential role of genetic variation in the SNP neighbourhood in the
342 magnitude of topological changes occurring with a single cocaine exposure.

343

344 We were surprised by the similarity of structural properties of the *Rbfox1* locus
345 found at 14 days post-cocaine exposure with that in hippocampal pyramidal neurons
346 (**Extended Data Fig. 6h**), a cell type with much higher baseline expression of *Rbfox1*
347 than DNs¹⁰. When modeled in the pyramidal neurons, *Rbfox1* polymers have distance
348 and variation similar to the cocaine-treated DNs at 14 days (**Extended Data Fig. 6h,**
349 **i**), suggesting that *Rbfox1* was either previously activated in DNs by the cocaine
350 exposure and/or may become sensitized to future activations. Together, these data
351 suggest that, by 14 days, the 3D genome structures of specific loci are not trivially
352 recovering their pre-drug state following cocaine exposure, but can additionally
353 undergo further structural rewiring, including loss of structural coherence, consistent
354 with a progressive cascade of disruption.

355

356 **Compartment A/B transitions affect one third of the genome and include CAGs**

357 To understand whether melting dynamics relate to broader scales of 3D
358 genome organization, we calculated compartment A/B classifications, reflecting open
359 and closed chromatin, respectively^{10,41}. Compartment changes occurred in 29% of the
360 genome and also highlighted long-term effects of a single cocaine exposure (**Extended**
361 **Data Fig. 7a, b**). For example, compartment transitions from A-B-A (saline to 1 day
362 to 14 days) are enriched for signaling genes (e.g. *Snca*, *Sst*), A-A-B transitions for
363 genes with roles in cell adhesion and response to external stimulus (e.g. *Clock*, *Tyr*),
364 and A-B-B transitions for synaptic transmission genes (e.g. *Oprm1*, *Gabra2*), many of
365 which are CAGs (**Extended Data Fig. 7c**). As shown previously¹⁰, compartment A/B
366 changes are mostly independent of melting and condensing events (**Extended Data**

367 **Fig. 7d**). These results show that compartment transitions are found at relevant regions
368 for the cocaine response, though they occur less frequently than TAD reorganization
369 and are independent of (de)condensation events.

370

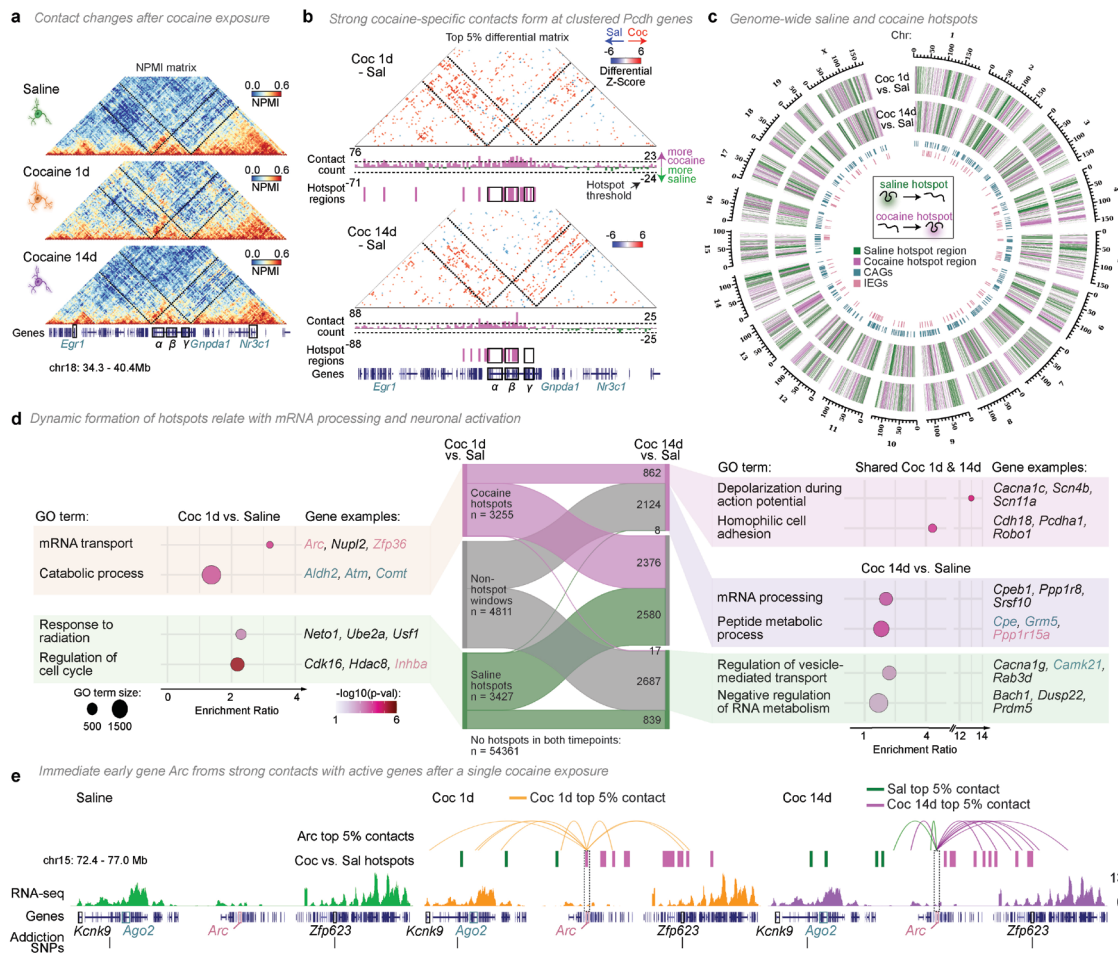
371 **Strong cocaine-specific contact regions involve cocaine-response genes and IEGs**

372 Finally, we also explored more complex structural changes across genomic
373 regions spanning several megabases, such as those seen at the clustered proto-cadherin
374 locus encoding cell adhesion genes (*Pcdh* α , β , and γ)⁴⁷, which show increased
375 contacts 1 day post-exposure with gene-dense regions up- and downstream that include
376 CAGs (**Fig. 4a**). To unbiasedly discover other ‘hotspot’ genomic windows
377 characterized by an excess of differential contact loops, we calculated differential
378 matrices between cocaine and saline treatments and determined the number of
379 differential loops that each genomic region establishes within 2.5 Mb distance, using a
380 previously reported approach^{10,29} (**Supplementary Table 6**). The whole *Pcdh* cluster
381 is detected as a hotspot of differential contacts 1-day post exposure, especially the β
382 cluster which also remains a hotspot of cocaine-specific contacts at 14 days post-
383 exposure (**Fig. 4b**).

384

385 When extended genome-wide, the contact hotspot analysis shows that the
386 genomic regions most affected by cocaine treatment are often clustered along the
387 linear genome (**Fig. 4c, Extended Data Fig. 8a**). Chromosome 18, for example, has
388 long contiguous stretches of hotspot windows within a given treatment (**Extended**
389 **Data Fig. 8b**). The average genomic length of contiguous hotspots of differential
390 contacts ranges from 1.9 - 2.6 Mb (\pm 0.1 - 0.2 mean standard error) and increase in
391 length after 14 days (**Extended Data Fig. 8c**), suggesting the local propagation of
392 chromatin structure disruption between 1- and 14-days post exposure. Many cocaine-

393 specific hotspots are maintained between 1 and 14 days ($n=862/3254$) and are enriched
 394 for genes related to membrane depolarization and cell adhesion, including the clustered
 395 *Pcdh* genes (Fig. 4d). Interestingly, cocaine-associated hotspots both at both 1 and 14
 396 days also include genes involved in mRNA transport, splicing and processing,
 397 consistent with widespread alternative splicing of pre-mRNAs described in VTA and
 398 NAc following chronic self-administration of cocaine⁴⁸.
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Fig. 4. Hotspots of strong structural changes occur at the *Pcdh* cluster, mRNA processing genes and *Arc*.

a, Strong cocaine-specific contacts are formed in windows containing the clustered
 406 protocadherin genes (α , β , and γ clusters; chr18: 34 - 40 Mb). b, Hotspot regions, top 5% of
 407 summed genomic windows containing differential contacts (dashed lines below matrix). c,
 408 Genome wide hotspots. d, Hotspot dynamics following cocaine exposure, and related GO
 409 enrichments. e, Example hotspot at *Arc* 1 day following cocaine (chr15: 72 - 77 Mb). *Arc*-
 410 anchored, treatment-specific, contacts are shown with orange (1 day cocaine), purple (14 day
 411 cocaine) and green (saline) lines below the hotspot track.

412

413 Cocaine-associated hotspots also include several IEGs, such as the memory-
414 and stress-associated genes *Arc*, *Hspa4*, *Ppp1r15a*, and *Zfp36* (**Extended Data Fig.**
415 **8d**)^{49–52}. The 1-day cocaine-specific hotspot at *Arc* is of particular interest, as *Arc* is
416 directly linked to the reinforcing properties of cocaine exposure and has been referred
417 to as the ‘master organizer of long-term synaptic plasticity’⁵³. We observed that *Arc*
418 gains contacts with upstream active genes specifically at 1-day post cocaine exposure,
419 including the addiction-associated gene *Ago2*⁵⁴, 1.5-Mb away, and the zinc-finger
420 transcription factor *Zfp623*, 1.3-Mb away, which contains a putative alcohol-
421 dependence SNP⁵⁵ (**Fig. 4e**). Though after 14 days, *Arc* is no longer within a hotspot
422 region, it maintains its strong contacts with *Zfp623*. These results suggest that IEGs, a
423 group of genes that remained down-regulated 14 days after a single cocaine exposure
424 (**Fig. 1g**), are present at genomic regions that acquire extensive cocaine-specific
425 contacts, including specific long-lasting contacts with critical cocaine- and addiction-
426 associated risk genes.

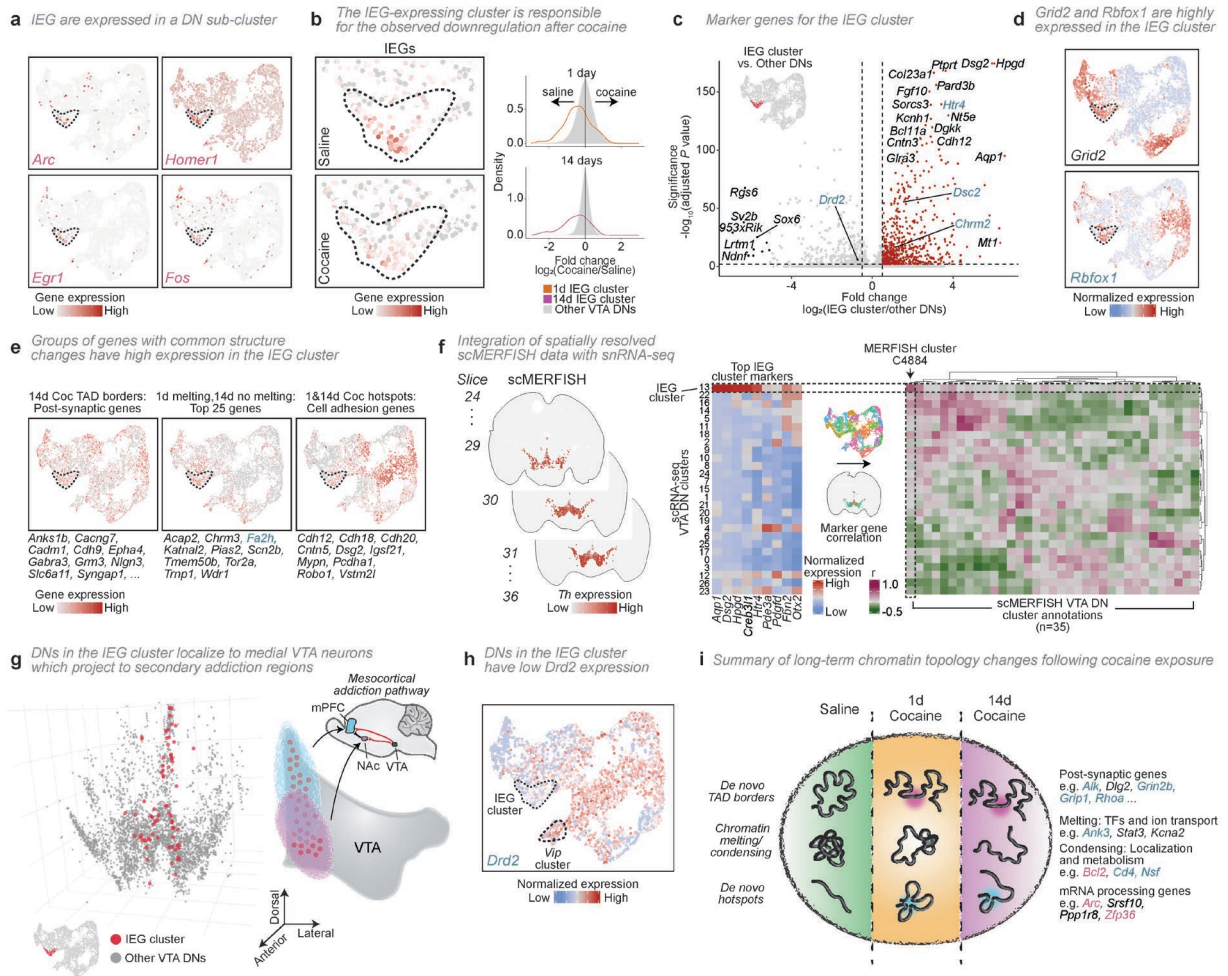
427

428 **A DN sub-cluster defined by IEGs and genes with chromatin contact changes**

429 **localizes to the medial VTA**

430 Having found extensive 3D genome structural changes at IEGs, CAGs and
431 many other genes upon cocaine exposure, we explored whether these genes were
432 expressed in specific DN subtypes, especially because previous work has shown that
433 DNs in different VTA subregions respond to different extents to a single
434 administration of cocaine *in vivo*⁵⁶, and project to secondary addiction regions^{57–59}. We
435 started by asking whether IEG expression, and their downregulation by 14 days after
436 cocaine exposure, was common across the population of DNs, or specific to a DN
437 subtype, by plotting their expression on the DN UMAPs. We found that some IEGs,

438 such as *Arc*, *Egr1*, *Fos*, and *Homer1*, are specifically and/or more highly expressed
 439 within a small DN sub-type in saline conditions (212/5537 DNs; **Fig. 5a**). This DN
 440 sub-population shows a high combined expression of IEGs, and when compared with
 441 all other DN subtypes, it is largely responsible for the observed down-regulation of
 442 IEGs after cocaine exposure (**Fig. 5b**; see full DN UMAP in **Extended Data Fig. 9a**).



443

444 **Figure 5. A DN sub-cluster localizes to the medial VTA, expresses genes with chromatin**
 445 **contact changes, and displays long-term IEG downregulation.**

446 **a**, UMAPs of example IEG expression in DNs. Dashed line indicates a DN sub-cluster with
 447 higher expression of indicated genes. **b**, IEGs are highly expressed in the DN sub-cluster, but
 448 downregulated after cocaine (Permutation test, $P = 1.3 \times 10^{-9}$ and 1.2×10^{-19} for 1d and 14d,
 449 respectively). Density plots show IEG expression in the ‘IEG cluster’ compared to all other
 450 DNs. **c**, Volcano plot of differentially expressed genes in the IEG cluster. Red dots indicate
 451 marker genes with higher expression in the cluster (Wilcoxon test, $P < 0.05$, fold-change > 1).
 452 UMAPs of **d**, individual examples or **e**, groups of genes with cocaine-induced chromatin
 453 structural changes that have high expression in the IEG cluster. **f**, Integration of sn-RNA-seq
 454 with single-cell MERFISH (scMERFISH)²⁷ and identification of the IEG cluster in
 455 scMERFISH by correlating top IEG cluster marker genes to scMERFISH cluster annotations.
 456 **g**, IEG cluster DNs (pink dots) localize to the medial VTA. The medial VTA projects to the

457 nucleus accumbens (NAc) and prefrontal cortex (mPFC)^{60,61}. **h**, UMAP of *Drd2* expression
458 showing low expression in the IEG cluster and high expression in the *Vip* cluster (dashed lines
459 correspond to cluster annotations on the left). Low *Drd2* expression in midline VTA DNs is
460 associated with increased LTP sensitivity after cocaine exposure^{56,61}. **i**, Summary of long-term
461 3D genome structural changes after a single cocaine exposure.
462

463 To characterize the ‘IEG-expressing’ cluster of DNs, we inspected their marker
464 genes and found many associated with addiction, such as *Chrm2*, *Dsc2*, *Hpgd*, *Htr4*,
465 and *Nt5e* (**Fig. 5c**, **Extended Data Fig. 9b**; see cluster 13 in **Supplementary Table**
466 **2**)^{57–59,62,63}. Importantly, the IEG cluster of DNs also shows high expression of many
467 addiction-associated genes which we found to undergo cocaine-induced chromatin
468 rewiring. Some examples include *Rbfox1*, with its extensive melting 14 days after
469 cocaine; *Grid2*, with very strong hotspots of differential contacts in saline which are
470 lost at both 1 and 14 days; and *Ptprt*, which condenses at 1 and 14 days (**Fig. 5d**,
471 **Extended Data Fig. 9c-e**). Other groups of genes with chromatin structural changes
472 also showed higher expression in the IEG cluster, including genes with the strongest
473 melting scores 1 day after cocaine, cell adhesion genes found within 1- and 14-day
474 cocaine hotspots, and synapse organization and postsynaptic genes found at new
475 cocaine TAD borders (**Fig. 5e**, see **Extended Data Fig. 9f** for other example groups).

476

477 **The IEG-expressing DNs locate to the medial VTA and have features of highly**
478 **cocaine-sensitive cells**

479 To investigate the VTA localization of the IEG-expressing DNs which more
480 highly express genes that undergo chromatin structural changes after cocaine exposure,
481 we took advantage of a recent MERFISH single-cell spatial transcriptomic atlas in the
482 mouse brain, based on the expression of 500 genes²⁷. We identified the brain slices
483 containing the VTA based on MERFISH annotations, and then correlated the
484 expression of DN marker genes defined in the present study with the VTA MERFISH

485 clusters (**Fig. 5f, Extended Data Fig. 10a**). The IEG-expressing DNs could be
486 robustly matched to a specific MERFISH cluster corresponding to 2% of all VTA DNs
487 (96/4115 DNs; **Fig. 5f**). Remarkably, we found that the IEG-expressing cluster of DNs
488 specifically localize along the entire VTA midline (**Fig. 5g, Supplementary Video 7**).
489 Previous work showed that DNs located in the ventral and dorsal midline of the VTA
490 project to the NAc and medial prefrontal cortex, respectively^{60,61,64}, which are two
491 regions associated with cocaine craving and relapse^{65,66}. As a control, we confirmed
492 that the cluster of *Vip*-expressing DNs could also be correctly assigned to the dorsal
493 midline, as expected⁶⁷ (**Extended Data Fig. 10b-d, Supplementary Video 8**).
494 Midline DNs which have the strongest cocaine response, characterized by high
495 postsynaptic LTP sensitivity, are known to project to the medial shell of the NAc and
496 are characterized by low expression of the dopamine auto-receptor *Drd2*. We found
497 that *Drd2* is lowly expressed in the IEG cluster of DNs compared with all other VTA
498 DNs, and more highly expressed in the *Vip* cluster (**Fig. 5c, h**), suggesting that the
499 small IEG-expressing cluster of DNs may be the most sensitive population of VTA
500 DNs to a single cocaine exposure.

501

502 **Discussion**

503 Upon a first drug exposure, neurons undergo a strong, though transient,
504 transcriptional and physiological response; however, where the cellular memory of that
505 exposure is stored is unknown. In this study, we discovered that a single dose of
506 cocaine is sufficient to induce large-scale reorganization of chromatin structure that
507 lasts far past the initial physiological response. We showed that genome rewiring
508 occurs across a broad spectrum of genomic distances and regions, with extensive
509 chromatin structural changes that affect numerous genes, including many associated
510 with cocaine, addiction, or synaptic plasticity (**Fig. 5i**). Chromatin reorganization seen

511 after 1 day of cocaine exposure often persists or can appear *de novo*, 2 weeks later,
512 well past reported transcriptional changes⁴⁻⁷ and LTP effects⁹, highlighting an
513 unexpected long-lasting storage of the effects from a first exposure to highly addictive
514 drugs in chromatin structures.

515

516 Our findings support the involvement of gross changes in 3D genome structure
517 and the hypothesis of long-term ‘chromatin memory’ storage in the inception of drug
518 addiction. *In vitro* studies have shown that chromatin sites can remain locally open
519 either by TF retention or new TF binding following synchronous neuronal activation,
520 though gene expression returns to its pre-activated state by 24 hours^{13,68}. Expanding
521 from the long-lasting TF-related chromatin regulation, we find extensive
522 reorganization of the 3D structure of genomic regions containing genes that encode for
523 neuronal activation TFs at 14 days post cocaine exposure, such as *Stat* genes in
524 melting regions. We also find traces of long-lasting changes related with IEG activity,
525 for example the presence of putative *Jun* binding sites at *Rbfox1* internal promoters
526 and intronic SNP, which are extensively decondensed 14 days post single exposure.
527 The widespread chromatin reorganization, across genomic scales, induced by cocaine
528 exposure suggests a larger contribution of chromosome structure to the cellular
529 memory of drug exposure than previously expected. Other cell-extrinsic mechanisms
530 are also likely to contribute to the cellular memory and long-term chromatin topology
531 changes, including nuclear involutions so far reported following *in-vitro* cocaine
532 exposure⁶⁹, homeostatic-related nuclear volume changes seen in epidermal self-
533 renewal⁷⁰, or changes to the physical state of chromatin due to altered nuclear ion
534 concentrations^{71,72}. Future work will be critical to tease apart both the cell-intrinsic and
535 cell-extrinsic mechanisms which lead to long-term chromatin changes induced by a

536 single exposure to cocaine, as well as efforts to explore potential recovery mechanisms
537 to pre-exposure states.

538

539 Midbrain DNs are a highly diverse cell type, which connect to different parts of
540 the brain with major roles in chronic addiction, such as the NAc and medial prefrontal
541 cortex^{60,61,64}. Each DN subtype has low abundance, for example, 96 IEG-expressing
542 DNs were reported in the MERFISH database, out of 4115 VTA DNs, which pose
543 further challenges in future research to understand their role in the inception of drug
544 addiction. The knowledge of the genes that are more extensively structurally
545 remodelled, obtained through GAM analyses, provides new insights into the long-term
546 effects of a single exposure to cocaine, for example by enabling the identification a
547 specific sub-type of DNs that more highly express these genes, as well as IEGs, and
548 the discovery that IEGs are downregulated at both 1 and 14 days after cocaine
549 exposure, especially in the same group of DNs. Given the widespread cocaine-induced
550 chromatin changes observed in GAM data collected from the full population of VTA
551 DNs, it is unlikely that chromatin reorganization is restricted to the IEG sub-cluster.
552 However, the genome structural changes within the IEG-expressing DNs may make
553 them more sensitive to further cocaine-induced topological alterations upon repeated
554 usage, especially in genome regions containing genes with important addiction-related
555 roles, such as in the postsynaptic LTP response, which are at baseline more expressed
556 in the IEG cluster than in other DNs. The IEG-expressing DNs weakly express the
557 dopamine auto-receptor, a feature of DNs with a highly sensitized cocaine response,
558 and localize to midline VTA areas, which are known to project to secondary addiction
559 brain regions^{56,61}. Further developments and targeted experimental designs will be
560 required to specifically study the very small populations of IEG-expressing DNs
561 towards understanding whether they undergo more severe cocaine-induced chromatin

562 changes compared with DNs that have different cocaine responses (i.e. inhibition
563 following reward learning)⁷³, and to further explore how cocaine-induced changes in
564 3D genome structure may specifically sensitize DNs that are highly activated by
565 cocaine.

566

567 There are some important limitations to the present study. The analysis of two
568 different genotypes in saline and cocaine, 1-day post-exposure, had value to show that
569 cocaine-induced disruption of chromatin structure occurs in both genotypes, which
570 also revealed locus-specific effects. Further work is needed to more broadly explore
571 the effects of genotype, individual variation, age and sex, as well as the cascade of
572 changes in 3D genome structure occurring before 1 day, until 14 days, and beyond. We
573 profiled ~5,500 DN transcriptomes from 20 animals, but their unexpected and
574 extensive subtype variability inevitably results in low cell representation in each
575 subcluster which limits the discovery of subcluster-specific changes in gene expression
576 upon cocaine. Our study supports the need for future large-scale projects to dissect the
577 effects and mechanisms of cocaine exposure on DN subtypes and other VTA cell
578 types, as well as other brain regions containing DNs.

579

580 Our work opens many new questions, including: Can chromatin structure
581 eventually recover to the pre-cocaine state, and is there a ‘critical wait period’ that
582 might avoid cumulative effects of subsequent exposures? Importantly, can the wait
583 period be shortened by external interventions? How does long-term chromatin
584 remodelling after a single cocaine exposure contribute to drug seeking or susceptibility
585 to addiction? Does the genetic and 3D genome make-up of individuals impact their
586 likelihood for a stronger disruption of chromatin structure and of developing
587 addiction? More broadly, our work also suggests the need to study the effects of other

588 addictive drugs on 3D chromatin structure, including drugs which target the reward-
589 learning (e.g. nicotine, amphetamine, alcohol) or other (e.g. heroin or fentanyl)
590 pathways.

591

592 Our work identifies unexpected long-term effects of drug usage on 3D
593 chromatin structure across the genome, including at drug-response genes, which may
594 be crucial in the homeostatic responses of specific DNAs. It highlights the plasticity of
595 3D genome structure in the context of addiction, as chromosomes are large physical
596 objects with specific structure which, when disturbed, may require long periods of time
597 to re-establish their healthy conformations, especially in non-dividing terminally
598 differentiated cells such as neurons. By mapping 3D genome structure, we open new
599 avenues to identify critical pathways and targets for intervention in the progression
600 towards addiction.

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631

632 **Author contributions**

633 Conceptualization: A.P., M.A.U., W.W.-N.; Data Curation: D.S., W.W.-N.,
634 V.F., S.B., M.Y.B., A.K., S.D.; Formal Analysis: D.S., W.W.-N., V.F., S.B., M.Y.B.,
635 A.K., I.I-A., A.M.C, J.P.L.-A.; Funding Acquisition: A.P., M.A.U., A.A., K.K., M.N.;
636 Investigation: W.W.N., M.Y.B., E.J.P, U.P., A.P.; Methodology: W.W.-N., D.S., V.F.,
637 A.P., S.B., A.A., K.K., M.N., U.P.; Project Administration: W.W.-N., A.P., D.S.;
638 Resources: A.P., A.A., K.K., M.N., M.A.U.; Software: D.S., V.F., W.W.N, S.B., A.K.,
639 I.I-A, A.M.C., M.Y.B, S.D.; Supervision: A.P., W.W.-N, A.A., M.A.U, K.K., M.N.;
640 Validation: V.F., D.S., W.W.-N., A.P., L.Z.-R., S.B., M.Y.B., E.J.P, A.K., I.I-A,
641 A.M.C, S.D., K.K., M.A.U.; Visualization: W.W.-N., D.S., A.P., V.F., S.B., M.Y.B.,
642 A.K.; Writing – original draft: W.W.-N., D.S., A.P.; Writing – review & editing: A.P.,
643 W.W.-N., D.S., V.F., M.A.U., E.J.P., L.Z.-R., M.Y.B, S.B., A.K., J.P.L-A.

644

645 **Competing interests**

646 A.P., and M.N. hold a patent on ‘Genome Architecture Mapping’: Pombo, A.,
647 Edwards, P. A. W., Nicodemi, M., Scialdone, A., Beagrie, R. A. Patent
648 PCT/EP2015/079413 (2015). All other authors have no competing interests.

649

650 **Materials & Correspondence**

651 Correspondence and requests for materials should be addressed to
652 ana.pombo@mdc-berlin.de or warren.winickng@utoronto.ca.

653 **Methods**

654

655 ***Animal maintenance***

656 GAM and snRNA-seq data was collected using C57Bl/6NCrl (RRID:
657 IMSR_CR:027; WT, Charles River), and TH-GFP (B6.Cg-Tg(TH-GFP)21-31/C57B6)
658 male mice as previously described¹⁰. All procedures were approved by the Imperial
659 College London's Animal Welfare and Ethical Review Body, and were conducted in
660 accordance with the Animals (Scientific Procedures) Act of 1986 (UK). All mice had
661 access to food and water *ad libitum* and were kept on a 12 h:12 h day/night cycle in
662 social groups of 3-4, with appropriate environmental enrichment. C57Bl/6NCrl and
663 TH-GFP mice received an intraperitoneal (IP) injection of either saline or cocaine
664 (15mg/kg body weight) 1 or 14 days or prior to the tissue collection. Cocaine-treated
665 and saline-treated mice were housed in separate groups. Mice used for GAM and
666 RNA-seq experiments were littermates. All mice were the same age at the time of
667 collection (8 weeks old) and sacrificed in parallel.

668

669 ***Tissue fixation and preparation for GAM***

670 Tissue was prepared for GAM as previously described¹⁰. Briefly, mice were
671 anesthetized with isoflurane (4 %), given a lethal IP injection of pentobarbital (0.08 µl;
672 100 mg/ml; Euthatal), and perfused with ice-cold phosphate buffered saline (PBS)
673 followed by approximately 100 ml of 4% depolymerised paraformaldehyde (PFA;
674 Electron microscopy grade, methanol free) in 250 mM HEPES-NaOH (pH 7.4-7.6;
675 PFA-HEPES). Following perfusion, brains were removed and the VTA was isolated
676 before quickly transferring to 4% PFA-HEPES for 1 h at 4°C, followed by 2-3 h in 8%
677 PFA-HEPES. Tissue was placed in 1% PFA-HEPES at 4°C until prepared for
678 cryopreservation.

679

680 ***Cryoblock preparation and cryosectioning***

681 VTA tissue samples were further dissected to produce ~3x3 mm tissue blocks
682 suitable for Tokuyasu cryosectioning¹⁰. Tissue blocks were post-fixed for 1 h at 4°C in
683 4% PFA-HEPES, before being transferred to 2.1 M sucrose in PBS for 16-24 h at 4°C.
684 Sucrose-embedded blocks were mounted on copper stub holders before being flash
685 frozen in liquid nitrogen. Tissue blocks were cryosectioned, as previously described¹⁰,
686 with an Ultracryomicrotome (Leica Biosystems, EM UC7) at a thickness of 220-
687 230nm and transferred onto a 4.0 µm polyethylene naphthalate (PEN; Leica
688 Microsystems, 11600289) membrane for laser microdissection.

689

690 ***Immunofluorescence detection for laser microdissection***

691 Cryosections on PEN membranes were washed 3x in PBS, quenched with
692 20mM glycine in PBS for 20 min, then permeabilized with 0.1% Triton X-100 in PBS.
693 After blocking for 1 h at room temperature in blocking solution (1% BSA (w/v), 0.2%
694 fish-skin gelatin (w/v), 0.05% casein (w/v) and 0.05% Tween-20 (v/v) in PBS),
695 cryosections were incubated in primary antibody overnight at 4°C with sheep anti-TH
696 (1:50; Pel Freez Arkansas, P60101-0), followed by 3-5 washes for 1h in blocking
697 solution at room temperature. Cryosections were incubated for 1h in secondary
698 antibody (1:1000 donkey anti-sheep conjugated with AlexaFluor-488; ThermoFisher
699 Scientific (Invitrogen)), followed by 2 washes in 0.5% Tween-20 in PBS and 1 wash
700 in water. After drying, cryosections were visualized as previously described¹⁰, using a
701 Leica laser microdissection microscope (Leica Microsystems, LMD7000) with a 63x
702 dry objective. TH-positive nuclei from cellular sections (nuclear profiles; NPs) were
703 laser microdissected, and collected into PCR adhesive caps (AdhesiveStrip 8C opaque;

704 Carl Zeiss Microscopy #415190-9161-000). Three NPs were collected into each cap,
705 with control lids not containing NPs (water controls) included for each dataset. In one
706 experiment (1 day cocaine exposure in the TH-GFP mouse), 34 single NPs were
707 collected into separate caps and later combined *in-silico* into 3 NPs (see ***GAM data***
708 ***window calling*** below; **Supplementary Table 7**).

709

710 ***Whole genome amplification of nuclear profiles***

711 Whole genome amplification (WGA) was performed as previously described¹⁰.
712 Briefly, NPs were lysed for 4 or 24 h at 60°C in lysis buffer (final concentration: 30
713 mM Tris-HCl pH 8.0, 2 mM EDTA pH 8.0, 800 mM Guanidinium-HCl, 5 % (v/v)
714 Tween 20, 0.5 % (v/v) Triton X-100) and 2.116 units/ml QIAGEN protease (Qiagen,
715 19155), before a 30 min protease inactivation at 75°C. Pre-amplification was done
716 using a 2x DeepVent mix (2x Thermo polymerase buffer (10x), 400 µM dNTPs, 4 mM
717 MgSO₄ in ultrapure water), 0.5 µM GAT-7N random hexamer primers with an adapter
718 sequence and 2 units/µl DeepVent[®] (exo-) DNA polymerase (New England Biolabs,
719 M0259L). DNA was further amplified as in the pre-amplification step above, except
720 with 100 µM GAT-COM primers.

721

722 ***GAM library preparation and high-throughput sequencing***

723 The amplified samples were purified using SPRI beads (0.725 or 1.7 ratio of
724 beads per sample volume), and prepared for sequencing as previously described using
725 the Illumina Nextera XT library preparation kit (Illumina #FC-131-1096) or an in-
726 house library preparation protocol¹⁰. Following library preparation, the DNA was
727 purified using SPRI beads (1.7 ratio of beads per sample volume) and an equal amount
728 of DNA from each sample was pooled together (up to 196 samples). The final pool
729 was additionally purified three times and analyzed using DNA High Sensitivity on-
730 chip electrophoresis (Agilent 2100 Bioanalyzer). Sequencing was completed using an
731 Illumina NextSeq 500 machine, according to manufacturer's instructions, using single-
732 end 75 bp reads. The number of sequenced reads for each sample can be found in
733 **Supplementary Table 7**.

734

735 ***Publicly available GAM datasets***

736 GAM data produced from VTA DN of animals treated with saline was
737 previously published¹⁰ and is publicly available in the GEO portal (accession
738 GSE148792) and the 4D Nucleome data portal (<https://data.4dnucleome.org>)⁷⁴. GAM
739 data produced from pyramidal glutamate neurons (PGNs) from the CA1 region of the
740 hippocampus (HC) and GAM data produced from embryonic stem cells (ESC) was
741 previously published^{10,41} and is publicly available in the GEO portal (accessions
742 GSE64881 and GSE148792) and the 4D Nucleome data portal. Publicly available
743 GAM datasets were downloaded from the 4D Nucleome portal and processed as
744 described below. Sample specifications are listed in the table below.

745

| Cell-type | Genotype | Treat-ment | Data type | Number of samples | 4D Nucleome portal accession | Publication |
|-----------|-------------------------------------|------------|-----------|-------------------|------------------------------|---|
| VTA DN | C57Bl/6NcrJ wild-type | Saline | GAM | 1755 | 4DNES2FWQBJW | Winick- Ng et al., 2021 |
| VTA DN | B6.Cg- Tg(TH_GFP) 21-31/C57B6 | Saline | GAM | 873 | 4DNESZ3RVI2B | Winick- Ng et al., 2021 |

| | | | | | | |
|---------------|---|---|-----|-----|------------------------------|---|
| HC CA1 PGN | C57Bl/6NCrl Satb2 ^{flox/flox} | - | GAM | 627 | 4DNES43FS97D | Winick- Ng et al., 2021 |
| ESC | 46C – Sox1- GFP | - | GAM | 747 | 4DNESALAVZ67 | Beagrie et al., 2017 |

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GAM data sequence alignment

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Sequence read alignment was performed as previously described^{10,29}. In brief, sequence reads from each GAM library were mapped to the mouse genome assembly GRCm38 (Dec. 2011, mm10) using Bowtie2 with default parameters⁷⁵, and removing reads with mapping quality <20, PCR duplicates and non-uniquely mapped reads.

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GAM data window calling and sample quality control

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Positive genomic windows present in each GAM library were identified as previously describe^{10,76}. Briefly, the number of nucleotides was calculated for equal-sized genomic windows (250 kb or 40 kb) in each GAM sample. Next, the percentage of orphan windows (i.e. positive windows flanked by both adjacent negative windows) was calculated for every percentile of the nucleotide coverage distribution to identify the percentile with the lowest percent of orphan windows for each GAM sample, and used as the optimal coverage threshold for positive window identification in that sample.

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Quality control metrics including the percentage of orphan windows in each sample, number of uniquely mapped reads to the mouse genome, and correlations from cross-well contamination for every sample can be found in **Supplementary Table 7**. Each sample was considered to be of good quality if they had < 70% orphan windows, > 50,000 uniquely mapped reads, and a cross-well contamination score (Jaccard index) of < 0.4. For each treatment and mouse replicate, individual experimental batches were also checked for the same quality control metrics to ensure minimal batch-to-batch variability. In the 1-day cocaine TH-GFP mouse dataset, 34 single NPs were collected, of which 32 passed quality controls. To create *in-silico* 3 NP samples, sequenced reads identified for the 30 single NPs with highest quality scores were combined in random sets of 3 single NPs to create 10 *in-silico* 3NP samples. The 2 remaining NPs were excluded from the final dataset. The number of samples in each treatment passing quality control is summarized in **Extended Data Fig. 1c**.

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Generation of pairwise chromatin contact matrices for visualization

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Pairwise contact matrices were generated as previously described¹⁰, by calculating pointwise mutual information (PMI) for all pairs of windows in the genome, followed by bounding between -1 and 1 to produce a normalized PMI (NPMI) value. For visualization, the genomic regions displayed in each figure are scaled between a range of 0 and the 99th percentile of NPMI values in each treatment.

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Insulation score and topological domain boundary calling

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TAD calling was performed by calculating insulation scores in NPMI normalized pairwise GAM contact matrices at 40-kb resolution, as previously described^{10,21}. In brief, the average interaction strength of all chromatin contacts within a sliding square of varying size (ranging from 240 - 1040 kb in increments of 80 kb) was calculated for each treatment and replicate, then log normalized relative to all

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791 calculated scores of a given square size across each chromosome. Insulation score
792 values of all samples are archived in **Supplementary Table 11** in a permanent data
793 repository⁷⁷.

794 TAD boundaries were identified using the 400kb-insulation square size.
795 Boundaries overlapping by at least 1 genomic bin (40 kb) were merged, then refined to
796 consider the minimum insulation score within the boundary and one window on each
797 side. 120-kb boundaries separated by at least 1 genomic bin were considered different
798 between datasets (chromosome Y was excluded from this analysis). For comparison of
799 Cocaine 14d-specific boundaries, the union of both replicates were used. TAD border
800 coordinates can be found in **Supplementary Table 4**.

801 802 **MELTRONIC analysis**

803 Contact density values were calculated from NPMI normalized pairwise GAM
804 contact matrices at 40-kb resolution with 10 equidistant square sizes between 240 -
805 1040 kb (in 80 kb increments). Our previously published statistical framework
806 MELTRON¹⁰ was extended to include the measurement of chromatin condensation, by
807 performance of an additional one-sided Kolmogorov-Smirnov test and the option to
808 perform genome-wide analyses (<https://github.com/pombo-lab/MELTRONIC>).
809 MELTRONIC compares cumulative probability distributions of contact density values
810 calculated for each input sample and genomic interval and computes the maximum
811 distance between the distributions by applying a Kolmogorov–Smirnov test. Obtained
812 p values were corrected for multiple testing using the Bonferroni method, and $-\log_{10}$
813 transformed to obtain a melting score.

814 Melting scores were calculated with MELTRONIC in 120 kb sliding windows
815 across the entire genome by comparing GAM samples of DNAs from cocaine treated
816 animals to the saline treated reference data. Genomic regions in which more than 50%
817 of NPMI values were missing within the insulation square, were excluded from the
818 analysis. Melting scores were assigned to the central 40 kb bin and mean smoothed
819 across three genomic bins. Genomic bins with a melting score above 5 or below -5
820 were identified as ‘melting’ or ‘condensing’, respectively, which identify the 33% of
821 the genome with the most extensive (de)condensation changes, in comparison with
822 45% when comparing two cell types (**Extended Data Fig. 5c, d**). For genome-wide
823 analysis, regions with reproducible melting states in both cocaine 14d replicates were
824 considered. A list of genome-wide MELTRONIC scores of all comparisons is reported
825 in **Supplementary Table 5**.

826 827 **Identification of compartments A and B**

828 Compartments were determined using 250 kb resolution co-segregation
829 matrices, as previously described¹⁰. Briefly, each chromosome was expressed as a
830 matrix of observed interactions $O(i, j)$ between locus i and locus j , and a matrix of
831 expected interactions, $E(i, j)$, where each genomic window pair represented the
832 average number of contacts with the same distance between i and j . The observed over
833 expected $O/E(i, j)$ matrix was determined by dividing O by E . A correlation matrix,
834 $C(i, j)$, was then generated between column i and column j of the O/E matrix before
835 applying PCA for the first three primary components of matrix C . The component
836 displaying the highest correlation with GC content was extracted, and loci with PCA
837 eigenvector values with the same sign and the strongest correlation with GC content
838 were designated as A compartments, while those with the opposite sign were identified
839 as B compartments. For chromosomes 5, 12 and 14, PC1 was selected based on
840 highest correlation with transcriptional activity, as the PC that correlated most with GC
841 content did not display a typical AB compartmentalization pattern⁷⁸.

842 Eigenvector values within compartment A on the same chromosome were
843 normalized within the range of 0 to 1, whereas values within compartment B on the
844 same chromosome were normalized within the range of -1 to 0. A full list of
845 eigenvector values and assigned compartment associations can be found in
846 **Supplementary Table 8**.

847 848 ***MELTRON analysis of long genes***

849 For calculation of melting scores of long genes, MELTRON was applied on
850 protein coding genes > 280 kb in length (n = 574), with the contact density of cocaine
851 samples compared to the saline treated reference. Genes with a melting score above 10
852 or below -10 in were identified as ‘melting’ or ‘condensing’, respectively. Genes with
853 reproducible melting states in both 14-day cocaine replicates were visualized in **Fig.**
854 **3a** and their transcription states analyzed further. A full list of all melting scores can be
855 found in **Supplementary Table 5**.

856 857 ***Transcription factor binding site motif analysis at Rbfox1 promoters and a putative*** 858 ***cocaine addiction SNP***

859 Transcription factor binding site enrichment (TFBS) analyses were computed
860 for *Rbfox1* promoters and putative SNP +/- 500 bp. Enrichment analyses were
861 performed using two independent methods from the MEME suite programs, ‘Analysis
862 of Motif Enrichment’ (AME)⁷⁹ and ‘Simple Enrichment Analysis’ (SEA)⁸⁰ with
863 default parameters and shuffled input sequences as the control sequences. In both
864 analyses, sequence enrichment was determined using the HOCOMOCO mouse (V11,
865 FULL) database. Sequence coordinates analyzed and a list of enriched transcription
866 factor binding site motifs in both analyses can be found in **Supplementary Table 9**.

867 868 ***Polymer modeling of the Rbfox1 locus***

869 To investigate the 3D structure of the *Rbfox1* locus, we employed the Strings
870 and Binders Switch (SBS) polymer model^{81,82}. In the SBS model, a chromatin region is
871 represented as a string of beads incorporating binding sites of different types which
872 can interact with cognate diffusing binding molecules. To infer the SBS polymers for
873 the *Rbfox1* locus in saline- and cocaine- (1 and 14 days) treated VTA DNAs, and in
874 untreated pyramidal glutamatergic neurons (PGNs) from the hippocampus¹⁰, we
875 employed PRISMR, a machine-learning-based method that takes pairwise contact data
876 as input, such as Hi-C⁴⁶ or GAM⁸³, and returns the optimal arrangement of binding
877 sites along the polymer to fit the input. Here, we used as input GAM experimental data
878 with NPMI normalization on a 5 Mb region around the *Rbfox1* gene (chr16: 4,800,000
879 - 9,810,000) at 30-kb resolution in saline and cocaine (1 and 14 days) treated VTA
880 DNAs, and in untreated PGNs. As output, PRISMR returned SBS polymers made of
881 1,670 beads, including 7 different types of binding sites, in all cases.

882 Next, to generate ensembles of 3D conformations representing the locus
883 folding, we performed standard Molecular Dynamics (MD) simulations of the SBS
884 model for each of the considered cases. In these simulations, the system of beads and
885 binders evolves according to the Langevin equation with classical interaction
886 potentials⁸⁴, with parameters employed in previous studies^{10,85}. Specifically, the hard-
887 core repulsion between all beads and binders is modeled with a truncated, shifted
888 Lennard-Jones (LJ) potential. The interactions between beads and cognate binders are
889 modeled by an attractive, short-ranged LJ potential, with an affinity taken in the range
890 from 3.0 to 8.0 K_BT (where K_BT is the Boltzmann constant and T the system
891 temperature) and equal for all binding site types for the sake of simplicity. An
892 additional non-specific interaction with lower affinity (from 0 K_BT to 2.7 K_BT) is set

893 among the polymer and the binders. Polymers are initially set in self-avoiding
894 conformations and the binders are randomly placed in the simulation box. For the sake
895 of simplicity, beads and binders have the same diameter $s = 1$ and mass $m = 1$,
896 expressed in dimensionless units. The total binder concentration is taken above the
897 transition threshold to ensure the polymers fold in their equilibrium globular phase⁸¹.
898 For each of the considered cases, we obtained ensembles of up to 1100 distinct
899 conformations at equilibrium. The MD simulations were performed using the freely
900 available LAMMPS software (v.5june2019)⁸⁶.

901 To obtain *in-silico* GAM NPMI matrices from the ensembles of 3D
902 conformations, we applied the *in-silico* GAM algorithm⁸³. Specifically, we simulated
903 the GAM protocol with 3 NPs per sample by aggregating the content of three *in-silico*
904 slices into one *in silico* tube¹⁰, by using 586 tubes for saline, 335 tubes for cocaine 1
905 day, and 404 tubes for cocaine 14 day treatments, as well as 209 tubes for untreated
906 PGNs, as in the corresponding GAM experiments. Finally, we applied the NPMI
907 normalization. To compare *in-silico* against experimental NPMI GAM matrices, we
908 computed Pearson's correlation coefficients.

909 To quantify the changes in 3D chromatin organization in the different
910 considered cases, we measured spatial distances between different locations of interest
911 within the *Rbfox1* gene in the model 3D structures. To convert distances from
912 dimensionless units σ to physical units (nm), we estimated the physical diameter of the
913 bead σ by optimizing the similarity between the *in-silico*⁸³ and experimental NPMI
914 GAM matrices in the different cases. We obtained values for σ of 43 nm in saline, 49
915 nm in cocaine 1 day, 56 nm in cocaine 14 days and in untreated PGNs, that
916 corresponds to a chromatin compaction factor comprised between 54 bp/nm and 70
917 bp/nm, consistent with values found in literature⁸⁷⁻⁸⁹ and used in previous polymer
918 modeling studies^{43,46,83}. To visualize chromatin organization in the different cases, we
919 also rendered example 3D structures from the derived ensembles by performing a
920 third-order spline of the polymer bead positions. We highlighted the *Rbfox1* gene
921 region in blue color, its left/right flanking regions in dark/light gray respectively and
922 represented different locations within the gene with colored spheres. Analyses and
923 plots were produced with the Anaconda package v.22.9.0 and the rendering of 3D
924 structures was produced using POV Ray, v.3.7 (<http://www.povray.org/>). All polymer
925 model 3D structures and pairwise distances produced for the analyses of this work are
926 archived in **Supplementary Tables 12-16** in a permanent data repository⁷⁷.

927

928 ***Determining differential contacts and hotspots between GAM datasets***

929 Significant differences in pairwise contacts between two GAM datasets was
930 determined as previously described¹⁰. Briefly, genomic windows with low detection ($<$
931 2% of the distribution of all detected windows in each chromosome) were removed
932 from both datasets, and NPMI contact frequencies were normalized by computing the
933 Z-score transformation. A differential matrix D was computed by subtracting the two
934 normalized matrices and a 5-Mb distance threshold was applied. The top 5%
935 significant differential contacts were obtained by fitting a normal distribution curve for
936 each chromosome and determining the upper and lower 5% from the curve.

937 Next, preferred (hotspot) contact regions for each compared dataset were
938 determined, as previously described²⁹, by first quantifying the number of top 5%
939 significant contacts in each genomic window for each dataset. A 'hotspot score' was
940 determined by computing the difference between the number of significant contacts in
941 each genomic window for each dataset. Significant hotspot scores were obtained by
942 fitting a normal distribution curve for each chromosome and determining the upper and

943 lower 5% from the fitted curve. A full list of genome-wide hotspot scores can be found
944 in **Supplementary Table 6**.

945

946 ***Gene ontology and synaptic gene ontology enrichment analysis***

947 Gene ontology (GO) term enrichment analysis was performed using
948 WebGestalt over-representation analysis (ORA)⁹⁰ using the ‘Geneontology’ functional
949 database category and ‘Biological Process’ as function database name. Overlap of
950 expressed genes with 3D genome features (TAD boundaries, melting/condensing
951 regions, compartments, hotspots) were determined with the valr R package v.0.6.8⁹¹,
952 bedtools v2.30.0⁷⁶ or pybedtools⁹². All DN expressed genes were used as the
953 background dataset. Default parameters were used to determine enrichments and the
954 top 20 terms were reported. For **Fig. 2b** and **Extended Data Fig. 4a**, example GO
955 terms with non-redundant gene identifiers and a significant enrichment ($p\text{-adj} < 0.05$)
956 were selected. A full list of unfiltered GO term enrichment results can be found in
957 **Supplementary Table 10**.

958 For synaptic gene ontology (SynGO) analysis³³, mouse gene ids were
959 converted to human gene homologs with the biomaRt R package v.2.55.2⁹³. DN
960 expressed genes were used as the background dataset and enrichments computed with
961 the default parameters of the SynGO release 1.1 (20210225 release). Biological
962 process terms that were significantly enriched ($p\text{-adj} < 0.05$) in at least one set were
963 visualized in **Fig. 2c**, **Extended Data Fig. 4b** and **Extended Data Fig. 5f**. A full list of
964 unfiltered SynGO term enrichment results can be found in **Supplementary Table 10**.

965

966 ***Collection of single nucleotide variants underlying substance addiction***

967 Single nucleotide polymorphisms (SNPs) associated with cocaine dependence
968 and comorbid addictions to alcohol, nicotine and opioids were collected from publicly
969 available resources^{19,24,94}. In case of positional overlap, SNP with lowest p-value was
970 used before conversion of genome coordinates of noncoding SNPs from human to
971 mouse coordinates with the liftOver R package v.1.22.0. Conservation in the genomic
972 neighborhood of the SNPs was assessed with CNEr v.1.34.0⁹⁵. SNPs found in genomic
973 regions in which at least 5 out of 7 bps are conserved were considered for downstream
974 analyses. A full list of addiction SNPs can be found in **Supplementary Table 1**.

975

976 ***Collection of immediate early genes and genes associated with cocaine addiction***

977 The gene set for immediate-early gene (IEG) induction in rodent brain was
978 obtained by intersecting datasets of previously identified neural gene expression
979 signatures in response to acute cocaine^{96,97} or kainic acid⁹⁸. The cutoff for
980 differentially expressed genes was adjusted for each dataset. In bulk tissue RNA-seq of
981 rat brain, genes with adjusted P value < 0.05 in the comparison between “Cocaine
982 Challenge” (SC) (10 mg/kg i.p; 1h after cocaine) and “No Challenge” (S24) were
983 considered as differentially expressed⁹⁶. To identify the transcriptional response in the
984 mouse nucleus accumbens to acute cocaine (20 mg/kg i.p; 1h after cocaine) in single
985 nucleus RNA-seq data, a combined cutoff for significance ($p\text{-value attached} < 0.05$)
986 and log2 fold change (\log_2 fold change > 0.5) was used⁹⁷. In RNA-seq data of mouse
987 hippocampal neuronal nuclei (nuRNA-seq), genes with adjusted p value less than 0.05
988 and log2 fold-change of at least 1 were considered as differentially expressed after
989 systemic administration of kainic acid (25 mg/kg i.p; 1h after kainic acid)⁹⁸. Genes that
990 were significantly upregulated in at least two datasets comprised the final IEGs gene
991 set (141 genes). The genomic coordinates of immediate early genes are provided in
992 **Supplementary Table 1**. Expression levels of immediate early genes and fold changes
993 after cocaine exposure can be found in **Supplementary Table 3**.

994 Genes associated with cocaine addiction were collected from publicly available
995 resources^{19,20,57,58,62,99,100}. The genomic coordinates of cocaine addiction associated
996 genes and are provided in **Supplementary Table 1**. Expression levels of cocaine
997 addiction associated genes in dopaminergic neurons and fold changes after cocaine
998 exposure can be found in **Supplementary Table 3**.

999

1000 ***Isolation of the VTA for single-nucleus RNA-sequencing***

1001 Mice were anaesthetised with 4% isoflurane and swiftly decapitated. Brains
1002 were removed and briefly washed in ice-cold sterile PBS, they were placed on fresh
1003 filter paper and a block of tissue containing the VTA was dissected using a sterile
1004 razor blade. The tissue was then snap-frozen in isopentane (2-Methylbutane; Sigma-
1005 Aldrich) at -55°C.

1006

1007 ***Isolation of nuclei for single-nucleus RNA-sequencing***

1008 VTA nuclei were isolated and prepared for single-nucleus RNA-sequencing as
1009 previously described¹⁷. VTA tissue was removed from the -80 °C and transferred into
1010 a 1 ml Dounce homogenizer containing 1 ml of pre-chilled homogenization buffer
1011 (250 mM sucrose, 25 mM KCl, 5 mM MgCl₂, 10 mM Tris pH 8.0, 1 mM DTT, 1x
1012 protease inhibitor (Roche, 11873580001), 0.4 U/ul RNase inhibitor (Takara, 2313B),
1013 0.2 U/ul SUPERase•In (Invitrogen, AM2696), 0.1% Triton X-100). Tissue was treated
1014 with 5 strokes of the loose pestle, followed by 15 strokes of the tight pestle and then
1015 filtered through a 40 µm cell strainer. Nuclei were spun down at 1000 x g for 8 min at
1016 4 °C. The pellet was then resuspended in a homogenization buffer with the final
1017 volume of 250 µl on ice. The suspension was mixed with 250 µl of 50% iodixanol
1018 solution (25 mM KCl, 5 mM MgCl₂, 10 mM Tris (pH 8.0), 50% iodixanol (60% stock
1019 from STEMCELL Technologies, 7820), 1x protease inhibitor (Roche, 11873580001),
1020 RNase inhibitor (0.4 U/ul; Takara, 2313B), SUPERase•In (0.2 U/ul; Invitrogen,
1021 AM2696), and 1 mM DTT) and overlaid on top of 29% iodixanol solution (25 mM
1022 KCl, 5 mM MgCl₂, 10 mM Tris (pH 8.0), 29% iodixanol, 1x protease inhibitor
1023 (Roche, 11873580001), RNase inhibitor (0.4 U/ul; Takara, 2313B), SUPERase•In (0.2
1024 U/ul; Invitrogen, AM2696), and 1 mM DTT) in an ultracentrifuge tube (Beckman
1025 Coulter, 343778) on ice. Gradients were spun down in the ultracentrifuge (Beckman
1026 Coulter, MAX-XP) using a swing bucket rotor (Beckman Coulter, TLS 55) at 14,000
1027 g_{max} (~10900 $g_{average}$) for 22 min at 4°C with slow acceleration and deceleration.
1028 Supernatant was carefully removed, and pellets were resuspended in ice-cold bovine
1029 serum albumin (BSA) blocking solution (1x phosphate-buffered saline (PBS)
1030 (AM9625, Ambion), 0.5% BSA (VWR, 0332-25G), 1 mM DTT, 2.4 mM MgCl₂, and
1031 RNase inhibitor (0.2 U/ul; Takara, 2313B)) and incubated on ice for 15 min. Before
1032 staining, splits were taken for the controls (isotype control, negative control, 7AAD
1033 only control, NeuN only control). The neuronal marker NeuN antibody (1 µg/µl,
1034 1:5670, Millipore, MAB3777X) was added to the sample and NeuN-only control. The
1035 control antibody (0.2 µg/µl, 1:1134, STEMCELL Technologies, 60070AD) was added
1036 to the isotype control. Antibodies were incubated for 10 min at 4 °C in the dark. After
1037 incubation, 1 ml of BSA blocking buffer was added and centrifuged at 1000 x g for 10
1038 min at 4 °C in a swing bucket. Pellets were resuspended in 200 µl BSA blocking
1039 buffer and filtered through a 35 µm strainer. Samples were then filled with BSA
1040 blocking buffer to a total volume of 500 µl and 0.75 µl of 7AAD (1 mg/ml, Sigma)
1041 was added.

1042

1043 FACS was performed using BD FACSAria III sorter using a 75 µm nozzle and
1044 controlled by BD FACSDiva 8.0.1 software. Single color controls were used for
compensation. Gates were set based on the FACS controls. Nuclei were selected using

1045 a FSC-A/SSC-A gate, doublets were removed using FSC-W/FSC-H and SSC-W/ SSC-
1046 H gates, nuclei were then further selected on the basis of 7AAD staining, and neuronal
1047 nuclei were sorted on the basis of NeuN staining (**Extended Data Fig. 1e**). Nuclei
1048 were collected into 5 μ l of BSA blocking buffer at 4 °C and directly processed for 10x
1049 Genomics library preparation.

1050

1051 *Single-nucleus mRNA library preparation*

1052 The chromium Single Cell 3' Reagent kit v3 (10x Genomics, 1000075) was
1053 utilized for most library preparations, with the standard protocol applied. For the
1054 library preparation of four biological replicates, the chromium Single Cell 3' Reagent
1055 kit v2 (10x Genomics, 1000009) was used (see **Extended Data Fig. 1f**). In brief,
1056 nuclei were counted under a brightfield microscope and mixed with the reverse
1057 transcription mix. Gel Beads were added and the mix was partitioned on Chips B (10x
1058 Genomics, 1000073) into GEMs using the Chromium Controller (10x Genomics, PN-
1059 120223) for reverse transcription. After reverse transcription, samples were frozen at -
1060 20 °C until further processing. Next, cDNA was cleaned, pre-amplified (12 PCR
1061 cycles), cleaned with SPRIselect beads and quantified before being frozen again at -20
1062 °C. The same quantity of cDNA was used during fragmentation, end-repair, and A-
1063 tailing for most samples. Fragments were then cleaned up using SPRIselect reagent
1064 and processed through the steps of adapter ligation, SPRIselect cleanup, and sample
1065 index PCR (using Chromium i7 Sample Indices (10x Genomics, PN-120262) for 11
1066 PCR cycles). Libraries were cleaned up with SPRIselect reagent and quantified using
1067 the Qubit HS dsDNA Assay Kit (Thermo Fisher Scientific, Q32854) with a Qubit
1068 Fluorometer, and also using the High Sensitivity DNA Kit (Agilent, 5067-4626) with
1069 an Agilent 2100 Bioanalyzer. Libraries were pooled according to the expected amount
1070 of nuclei per sample and sequenced using an Illumina HiSeq 2000 machine according
1071 to manufacturer's instructions.

1072

1073 *Single-nucleus RNA-seq data processing: mapping, expression, and QC*

1074 Raw RNA sequencing data was processed using the pigx-scrnaseq pipeline,
1075 version 1.1.7¹⁰¹. In short, the sequencing reads were mapped using STAR¹⁰² on the
1076 mm10 version of the mouse genome. The digital expression matrix was constructed
1077 using the mm10 mouse gene annotation GRCm38.82, downloaded from the
1078 ENSEMBL database¹⁰³. Gene expression was quantified by counting the reads
1079 overlapping complete gene models (both exons and introns) and normalized using the
1080 Seurat pipeline with default parameters. Ambient RNA was removed from the digital
1081 expression matrix using CellBender¹⁸ with the default parameters.

1082

1083 *Single-nucleus RNA-seq quality control*

1084 Putative droplet doublets were detected using scDbtFinder¹⁰⁴ and only singlet
1085 cells were kept for further analysis. To ensure high cell quality, cells with fewer than
1086 2000 detected features were removed from the analysis. In addition, cells with a ratio
1087 of exonic to intronic reads lower than the 5% percentile or greater than the 95%
1088 percentile (calculated on a per sample basis) were also removed from further analysis.
1089 Because the previous stringent quality control filters removed the majority of cells
1090 sequenced using 10x v2 chemistry (saline, and cocaine day 1 replicates 1 and 2), the
1091 v2 chemistry samples were removed from any further analysis.

1092 The resulting filtered data was integrated using Conos¹⁰⁵. Integrated data
1093 processed using Seurat¹⁰⁶ - data was normalized, scaled, transformed using principal
1094 component analysis. Data was embedded in a low dimensional state using the UMAP
1095 algorithm¹⁰⁷.

1096 Clustering was completed using the FindClusters method from the Seurat
1097 package using the Conos derived cell distance graph. The clustering was obtained
1098 using the Louvain algorithm with resolution parameter set to 0.1.

1099

1100 ***Single nucleus RNA-seq dopaminergic cell identification***

1101 Cells were scored with a set of well-known dopaminergic marker genes *Th*,
1102 *Slc6a3*, *Nr4a2*, *Slc18a2*, *Snca*, *Foxa2*, *Lmx1b*, *Kcnj6*²⁶, using the Seurat function
1103 AddModuleScore. Cells belonging to the cluster with the highest median dopaminergic
1104 score were regarded as putative dopaminergic neurons. To remove nuclei which may
1105 have come from the substantia nigra (SN), the DN-containing region neighbouring the
1106 VTA, a set of known SN markers *Sox6*, *Aldh1a7*, *Ndnf*, *Serpine2*, *Rbp4*, *Fgf20* were
1107 used as an input to the AddModuleScore function, and all cells with a score greater
1108 than 0.65 were removed from the analysis. The resulting DNs were processed using
1109 the default Seurat pipeline, including read count normalization, scaling, and PCA
1110 calculation. The data was then embedded in 2D space using the UMAP algorithm.
1111 Cluster specific markers were determined using the FindAllMarkers function from the
1112 Seurat package.

1113 To obtain a robust set of markers specific for the “IEG” cluster (**Fig. 5c**),
1114 differential genes were iteratively defined by comparing the IEG cluster with all other
1115 clusters, and taking genes which were significantly enriched in the IEG cluster in all
1116 comparisons.

1117 Gene set scores for melting genes, hotspot genes and TAD boundary genes
1118 were obtained using the AUCell function from the AUCell bioconductor package¹⁰⁸.

1119

1120 ***Single-nucleus RNA-seq differential expression analysis***

1121 Differential expression analysis was calculated for the complete datasets of
1122 dopaminergic cells, and separately for the IEG subcluster. The per cell count data was
1123 summarized as pseudo-bulk values using the muscat package¹⁰⁹. Differential
1124 expression analysis was then completed using all three of the available methods
1125 implemented in the muscat package: edgeR, DESeq2 and limma. None of the methods
1126 were sensitive enough to detect individual differentially expressed genes with an FDR-
1127 adjusted P value lower than 0.05. A full list of expression values and differential
1128 expression analysis results can be found in **Supplementary Table 3**.

1129 Gene set differential expression was performed by first computing the mean
1130 and median fold change of IEGs or addiction genes in both the complete DN dataset
1131 and the IEG cluster. To determine the significance of the mean (and median) fold
1132 change, the mean (median) fold change was calculated for 1000 random subsets of
1133 genes of the same size as the corresponding gene sets (**Extended Data Fig. 7g**). The
1134 Z-score and P value was calculated by comparing the measured fold change of the true
1135 corresponding gene set with the distribution of the random permutations.

1136

1137 ***Integration of spatial transcriptomics MERFISH data***

1138 The single-cell MERFISH (scMERFISH) spatial transcriptomics dataset was
1139 downloaded from the Allen brain atlas server²⁷, along with the corresponding cell and
1140 cluster annotations specified below.

| Genotype | Data type | Number of cells | Sample identifier | Expression matrix link | Metadata link | Publication |
|----------|-----------|-----------------|-------------------|------------------------|---------------|-------------|
|----------|-----------|-----------------|-------------------|------------------------|---------------|-------------|

| | | | | | | |
|----------|---------|--|------------------------|--|-----------------------------------|----------------------------------|
| C57Bl/6J | MERFISH | 4.3M cells of 59 full coronal sections | MERFISH-C57BL6J-638850 | C57BL6J-638850-log2.h5ad | cell_metadata.csv | Yao et al., 2024 |
|----------|---------|--|------------------------|--|-----------------------------------|----------------------------------|

1141 Cells belonging to the VTA were selected from the dataset by taking a subset
1142 of cells with the “MB Dopa” class annotation. Cells belonging to the substantia nigra
1143 part of the midbrain were filtered based on the high expression of the following
1144 markers: *Ndnf*, *Tll11*, *Epha4*, *Rgs8*. To compare the scMERFISH and snRNA-seq data,
1145 both datasets were summarized to the cluster level by taking the average expression of
1146 all genes in all corresponding clusters. Next, genes which had linear covariation in
1147 both datasets were selected by calculating the variance separately for the scMERFISH
1148 and snRNA-seq data and choosing genes with a log2 ratio of (snRNA-seq variance) /
1149 (scMERFISH variance) between -0.25 and 0.25 for further analysis. Pearson
1150 correlation coefficients were calculated between each snRNA-seq and scMERFISH
1151 cluster, and the resulting matrix was visualized using the ComplexHeatmap¹¹⁰
1152 package. The correspondence between snRNAseq and scMERFISH clusters was
1153 determined by selecting the pair of clusters with the largest calculated correlation
1154 coefficient.

1155

1156 **Data availability**

1157 Raw fastq sequencing files for GAM datasets generated for this manuscript,
1158 together with non-normalized co-segregation matrices, normalized pair-wised
1159 chromatin contacts maps and raw GAM segregation tables are available from the GEO
1160 repository under accession number [GSE254508](#) and from the 4DN data portal
1161 (<https://data.4dnucleome.org/>) under accession identifiers [4DNESYLI75YL](#) (1 day
1162 cocaine, wild-type), [4DNESMAQEPWU](#) (1 day cocaine, TH-GFP), and
1163 [4DNESVF6WL86](#) (14 days cocaine, wild-type). Raw fastq sequencing files for GAM
1164 datasets of VTA DN from animals treated with saline are available from the 4DN data
1165 portal under accession identifiers [4DNES2FWQBJW](#) (wild-type) and
1166 [4DNESZ3RVI2B](#) (TH-GFP). Insulation score values of all samples are archived in
1167 table S11 in a permanent data repository⁷⁷. All polymer model 3D structures and
1168 pairwise distances produced for the analyses of this work are archived in table S12-16
1169 in a permanent data repository⁷⁷.

1170 Raw fastq single nucleus RNA sequencing files, bigwig tracks of DN and
1171 count matrices are available from the GEO repository under accession number
1172 [GSE254509](#). Seurat objects of all sequenced neurons (NeuN⁺) and all profiled
1173 dopaminergic neurons are archived in a permanent data repository⁷⁷. An interactive
1174 application for exploration of snRNA-seq data of dopaminergic neurons is available
1175 under the following link: https://shiny.mdc-berlin.de/APombo_VTA. scMERFISH
1176 spatial transcriptomics data of dopaminergic neurons of the ventral tegmental area are
1177 archived in table S17 in a permanent data repository⁷⁷. Interactive 3D plots indicating
1178 locations of IEG expressing DN and Vip⁺ DN in the VTA are archived in interactive
1179 plot S1-S2 in a permanent data repository⁷⁷. A public UCSC genome browser session
1180 with all data produced is accessible under the following link: [http://genome-](http://genome-euro.ucsc.edu/s/Kjmorris/GAMcocaine_2024_publicSession)
1181 [euro.ucsc.edu/s/Kjmorris/GAMcocaine_2024_publicSession](http://genome-euro.ucsc.edu/s/Kjmorris/GAMcocaine_2024_publicSession).

1182

1183 **Code availability**

1184 Processing, analysis and plotting scripts for insulation score calculation and
1185 MELTRONIC analyses are available at: <https://github.com/pombo-lab/MELTRONIC/>.

1186 **References**

1187

- 1188 1. Ungless, M. A., Whistler, J. L., Malenka, R. C. & Bonci, A. Single cocaine
1189 exposure in vivo induces long-term potentiation in dopamine neurons. *Nature*
1190 **411**, 583–587 (2001).
- 1191 2. Ungless, M. A., Argilli, E. & Bonci, A. Effects of stress and aversion on
1192 dopamine neurons: Implications for addiction. *Neuroscience & Biobehavioral*
1193 *Reviews* **35**, 151–156 (2010).
- 1194 3. Wise, R. A. & Robble, M. A. Dopamine and Addiction. *Annu. Rev. Psychol.* **71**,
1195 79–106 (2020).
- 1196 4. Jaeger, B. N. *et al.* A novel environment-evoked transcriptional signature predicts
1197 reactivity in single dentate granule neurons. *Nat Commun* **9**, 3084 (2018).
- 1198 5. Ryan, M. M. *et al.* Temporal Profiling of Gene Networks Associated with the
1199 Late Phase of Long-Term Potentiation In Vivo. *PLOS ONE* **7**, e40538 (2012).
- 1200 6. Ibarra, I. L. *et al.* Comparative chromatin accessibility upon BDNF stimulation
1201 delineates neuronal regulatory elements. *Molecular Systems Biology* **18**, e10473
1202 (2022).
- 1203 7. Kim, T.-K. *et al.* Widespread transcription at neuronal activity-regulated
1204 enhancers. *Nature* **465**, 182–187 (2010).
- 1205 8. Suto, N., Tanabe, L. M., Austin, J. D., Creekmore, E. & Vezina, P. Previous
1206 Exposure to VTA Amphetamine Enhances Cocaine Self-Administration under a
1207 Progressive Ratio Schedule in an NMDA, AMPA/Kainate, and Metabotropic
1208 Glutamate Receptor-Dependent Manner. *Neuropsychopharmacol* **28**, 629–639
1209 (2003).
- 1210 9. Campbell, R. R. *et al.* Cocaine induces paradigm-specific changes to the
1211 transcriptome within the ventral tegmental area. *Neuropsychopharmacol.* **46**,
1212 1768–1779 (2021).
- 1213 10. Winick-Ng, W. *et al.* Cell-type specialization is encoded by specific chromatin
1214 topologies. *Nature* **599**, 684–691 (2021).
- 1215 11. Engmann, O. *et al.* Cocaine-Induced Chromatin Modifications Associate With
1216 Increased Expression and Three-Dimensional Looping of *Auts2*. *Biological*
1217 *Psychiatry* **82**, 794–805 (2017).
- 1218 12. Carpenter, M. D. *et al.* Nr4a1 suppresses cocaine-induced behavior via epigenetic
1219 regulation of homeostatic target genes. *Nat Commun* **11**, 504 (2020).
- 1220 13. Beagan, J. A. *et al.* Three-dimensional genome restructuring across timescales of
1221 activity-induced neuronal gene expression. *Nat Neurosci* **23**, 707–717 (2020).
- 1222 14. Stewart, A. F., Fulton, S. L. & Maze, I. Epigenetics of Drug Addiction. *Cold*
1223 *Spring Harb Perspect Med* **11**, a040253 (2021).
- 1224 15. Saal, D., Dong, Y., Bonci, A. & Malenka, R. C. Drugs of Abuse and Stress
1225 Trigger a Common Synaptic Adaptation in Dopamine Neurons. *Neuron* **37**, 577–
1226 582 (2003).
- 1227 16. Borgland, S. L., Malenka, R. C. & Bonci, A. Acute and Chronic Cocaine-Induced
1228 Potentiation of Synaptic Strength in the Ventral Tegmental Area:
1229 Electrophysiological and Behavioral Correlates in Individual Rats. *J. Neurosci.*
1230 **24**, 7482–7490 (2004).
- 1231 17. Batiuk, M. Y. *et al.* Upper cortical layer–driven network impairment in
1232 schizophrenia. *Science Advances* **8**, eabn8367 (2022).
- 1233 18. Fleming, S. J. *et al.* Unsupervised removal of systematic background noise from
1234 droplet-based single-cell experiments using CellBender. *Nat Methods* **20**, 1323–
1235 1335 (2023).

- 1236 19. Hu, R., Dai, Y., Jia, P. & Zhao, Z. ANCO-GeneDB: annotations and
1237 comprehensive analysis of candidate genes for alcohol, nicotine, cocaine and
1238 opioid dependence. *Database* **2018**, bay121 (2018).
- 1239 20. Piñero, J. *et al.* The DisGeNET knowledge platform for disease genomics: 2019
1240 update. *Nucleic Acids Research* **48**, D845–D855 (2020).
- 1241 21. Crane, E. *et al.* Condensin-driven remodelling of X chromosome topology during
1242 dosage compensation. *Nature* **523**, 240–244 (2015).
- 1243 22. Winick-Ng, W., Leri, F. & Kalisch, B. E. Nitric oxide and histone deacetylases
1244 modulate cocaine-induced mu-opioid receptor levels in PC12 cells. *BMC*
1245 *Pharmacology and Toxicology* **13**, 11 (2012).
- 1246 23. Madeira, M. D. *et al.* Chronic Alcohol Consumption and Withdrawal Do Not
1247 Induce Cell Death in the Suprachiasmatic Nucleus, But Lead to Irreversible
1248 Depression of Peptide Immunoreactivity and mRNA Levels. *J. Neurosci.* **17**,
1249 1302–1319 (1997).
- 1250 24. Cezard, T. *et al.* The European Variation Archive: a FAIR resource of genomic
1251 variation for all species. *Nucleic Acids Research* **50**, D1216–D1220 (2022).
- 1252 25. Nunn, C., Mao, H., Chidiac, P. & Albert, P. R. RGS17/RGSZ2 and the RZ/A
1253 family of regulators of G-protein signaling. *Seminars in Cell & Developmental*
1254 *Biology* **17**, 390–399 (2006).
- 1255 26. La Manno, G. *et al.* Molecular Diversity of Midbrain Development in Mouse,
1256 Human, and Stem Cells. *Cell* **167**, 566–580.e19 (2016).
- 1257 27. Yao, Z. *et al.* A high-resolution transcriptomic and spatial atlas of cell types in
1258 the whole mouse brain. *Nature* **624**, 317–332 (2023).
- 1259 28. Aitken, S. *et al.* Transcriptional Dynamics Reveal Critical Roles for Non-coding
1260 RNAs in the Immediate-Early Response. *PLOS Computational Biology* **11**,
1261 e1004217 (2015).
- 1262 29. Beagrie, R. A. *et al.* Multiplex-GAM: genome-wide identification of chromatin
1263 contacts yields insights overlooked by Hi-C. *Nat Methods* **20**, 1037–1047 (2023).
- 1264 30. Toda, S., Shen, H.-W., Peters, J., Cagle, S. & Kalivas, P. W. Cocaine Increases
1265 Actin Cycling: Effects in the Reinstatement Model of Drug Seeking. *J. Neurosci.*
1266 **26**, 1579–1587 (2006).
- 1267 31. deBacker, J. *et al.* GluN2B-Containing NMDA Receptors Blockade Rescues
1268 Bidirectional Synaptic Plasticity in the Bed Nucleus of the Stria Terminalis of
1269 Cocaine Self-Administering Rats. *Neuropsychopharmacol* **40**, 394–405 (2015).
- 1270 32. Ghasemzadeh, M. B., Windham, L. K., Lake, R. W., Acker, C. J. & Kalivas, P.
1271 W. Cocaine activates Homer1 immediate early gene transcription in the
1272 mesocorticolimbic circuit: Differential regulation by dopamine and glutamate
1273 signaling. *Synapse* **63**, 42–53 (2009).
- 1274 33. Koopmans, F. *et al.* SynGO: An Evidence-Based, Expert-Curated Knowledge
1275 Base for the Synapse. *Neuron* **103**, 217–234.e4 (2019).
- 1276 34. Argilli, E., Sibley, D. R., Malenka, R. C., England, P. M. & Bonci, A.
1277 Mechanism and Time Course of Cocaine-Induced Long-Term Potentiation in the
1278 Ventral Tegmental Area. *J. Neurosci.* **28**, 9092–9100 (2008).
- 1279 35. Tan, H. L., Chiu, S.-L., Zhu, Q. & Huganir, R. L. GRIP1 regulates synaptic
1280 plasticity and learning and memory. *Proceedings of the National Academy of*
1281 *Sciences* **117**, 25085–25091 (2020).
- 1282 36. Cazorla, M., Shegda, M., Ramesh, B., Harrison, N. L. & Kellendonk, C. Striatal
1283 D2 Receptors Regulate Dendritic Morphology of Medium Spiny Neurons via
1284 Kir2 Channels. *J. Neurosci.* **32**, 2398–2409 (2012).
- 1285 37. Franke, M. *et al.* Formation of new chromatin domains determines pathogenicity
1286 of genomic duplications. *Nature* **538**, 265–269 (2016).

- 1287 38. Despang, A. *et al.* Functional dissection of the Sox9–Kcnj2 locus identifies
1288 nonessential and instructive roles of TAD architecture. *Nat Genet* **51**, 1263–1271
1289 (2019).
- 1290 39. Scobie, K. N. *et al.* Essential role of poly(ADP-ribosyl)ation in cocaine action.
1291 *Proceedings of the National Academy of Sciences* **111**, 2005–2010 (2014).
- 1292 40. Dutton III, J. W., Chen, H., You, C., Brodie, M. S. & Lasek, A. W. Anaplastic
1293 lymphoma kinase regulates binge-like drinking and dopamine receptor sensitivity
1294 in the ventral tegmental area. *Addiction Biology* **22**, 665–678 (2017).
- 1295 41. Beagrie, R. A. *et al.* Complex multi-enhancer contacts captured by genome
1296 architecture mapping. *Nature* **543**, 519–524 (2017).
- 1297 42. Liu, S. *et al.* Cell-type-specific 3D-genome organization and transcription
1298 regulation in the brain. 2023.12.04.570024 Preprint at
1299 <https://doi.org/10.1101/2023.12.04.570024> (2023).
- 1300 43. Leidescher, S. *et al.* Spatial organization of transcribed eukaryotic genes. *Nat Cell*
1301 *Biol* **24**, 327–339 (2022).
- 1302 44. Liu, Z. *et al.* Linking genome structures to functions by simultaneous single-cell
1303 Hi-C and RNA-seq. *Science* **380**, 1070–1076 (2023).
- 1304 45. Feng, J. *et al.* Chronic cocaine-regulated epigenomic changes in mouse nucleus
1305 accumbens. *Genome Biology* **15**, R65 (2014).
- 1306 46. Bianco, S. *et al.* Polymer physics predicts the effects of structural variants on
1307 chromatin architecture. *Nat Genet* **50**, 662–667 (2018).
- 1308 47. Monahan, K. *et al.* Role of CCCTC binding factor (CTCF) and cohesin in the
1309 generation of single-cell diversity of Protocadherin- α gene expression.
1310 *Proceedings of the National Academy of Sciences* **109**, 9125–9130 (2012).
- 1311 48. Xu, S.-J. *et al.* Chromatin-mediated alternative splicing regulates cocaine-reward
1312 behavior. *Neuron* **109**, 2943–2966.e8 (2021).
- 1313 49. Korb, E. & Finkbeiner, S. Arc in synaptic plasticity: from gene to behavior.
1314 *Trends in Neurosciences* **34**, 591–598 (2011).
- 1315 50. Zuo, D., Subjeck, J. & Wang, X.-Y. Unfolding the Role of Large Heat Shock
1316 Proteins: New Insights and Therapeutic Implications. *Frontiers in Immunology* **7**,
1317 (2016).
- 1318 51. Gambardella, G. *et al.* GADD34 is a modulator of autophagy during starvation.
1319 *Science Advances* **6**, eabb0205 (2020).
- 1320 52. Sun, X. *et al.* Tristetraprolin destabilizes NOX2 mRNA and protects
1321 dopaminergic neurons from oxidative damage in Parkinson’s disease. *The FASEB*
1322 *Journal* **34**, 15047–15061 (2020).
- 1323 53. Shepherd, J. D. & Bear, M. F. New views of Arc, a master regulator of synaptic
1324 plasticity. *Nat Neurosci* **14**, 279–284 (2011).
- 1325 54. Schaefer, A. *et al.* Argonaute 2 in dopamine 2 receptor-expressing neurons
1326 regulates cocaine addiction. *Journal of Experimental Medicine* **207**, 1843–1851
1327 (2010).
- 1328 55. Kapoor, M. *et al.* A meta-analysis of two genome-wide association studies to
1329 identify novel loci for maximum number of alcoholic drinks. *Hum Genet* **132**,
1330 1141–1151 (2013).
- 1331 56. Lammel, S. *et al.* Unique Properties of Mesoprefrontal Neurons within a Dual
1332 Mesocorticolimbic Dopamine System. *Neuron* **57**, 760–773 (2008).
- 1333 57. Luo, X. *et al.* CHRM2 gene predisposes to alcohol dependence, drug dependence
1334 and affective disorders: results from an extended case-control structured
1335 association study. *Human Molecular Genetics* **14**, 2421–2434 (2005).

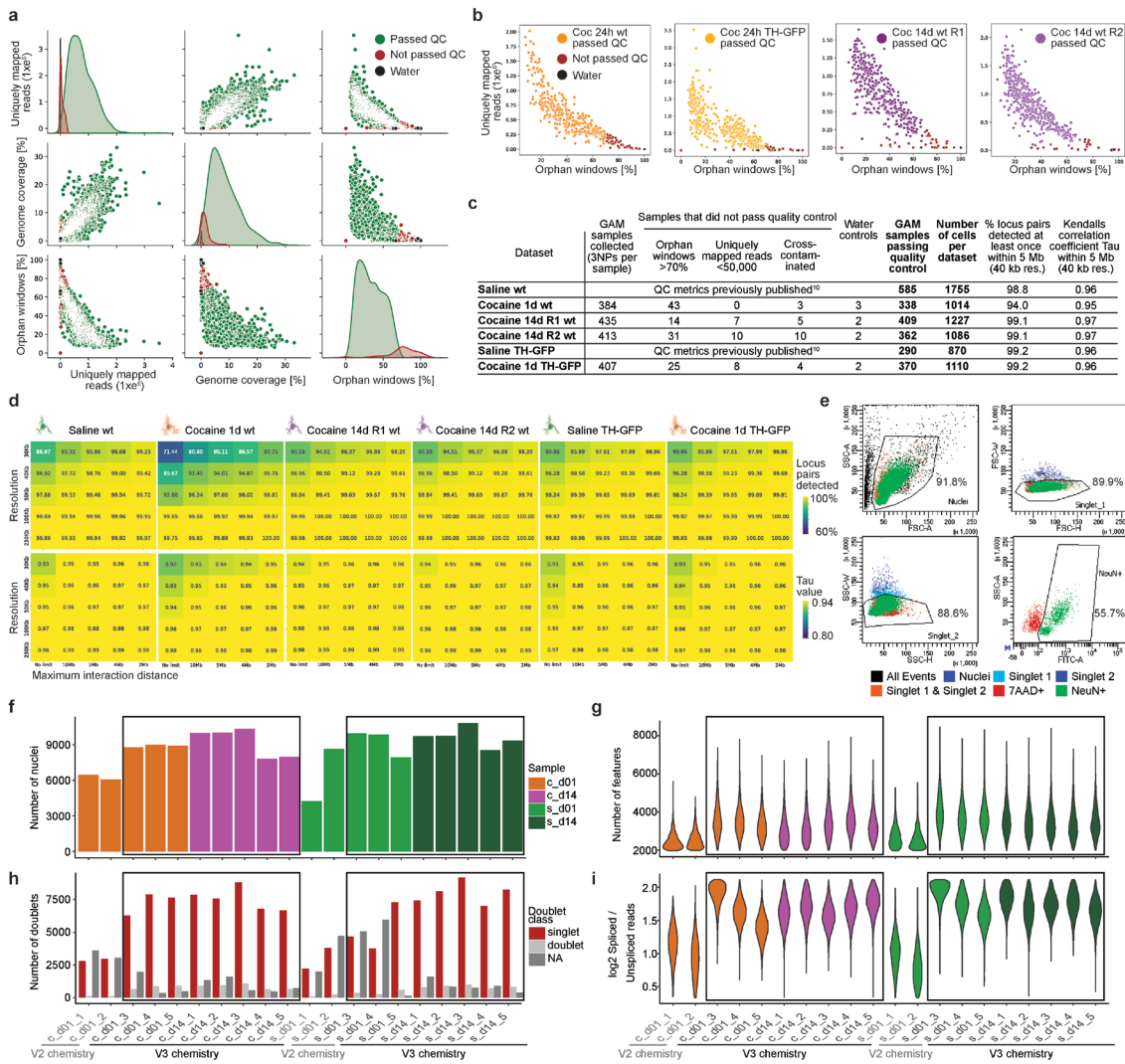
- 1336 58. Oliver, R. J. *et al.* Neuronal RNA-binding protein HuD regulates addiction-
1337 related gene expression and behavior. *Genes, Brain and Behavior* **17**, e12454
1338 (2018).
- 1339 59. Yang, M. H. *et al.* Gene Expression Profiling of the Rewarding Effect Caused by
1340 Methamphetamine in the Mesolimbic Dopamine System. *Molecules and Cells* **26**,
1341 121–130 (2008).
- 1342 60. Beier, K. T. *et al.* Circuit Architecture of VTA Dopamine Neurons Revealed by
1343 Systematic Input-Output Mapping. *Cell* **162**, 622–634 (2015).
- 1344 61. Lammel, S., Ion, D. I., Roeper, J. & Malenka, R. C. Projection-Specific
1345 Modulation of Dopamine Neuron Synapses by Aversive and Rewarding Stimuli.
1346 *Neuron* **70**, 855–862 (2011).
- 1347 62. Eipper-Mains, J. E. *et al.* Effects of cocaine and withdrawal on the mouse nucleus
1348 accumbens transcriptome. *Genes, Brain and Behavior* **12**, 21–33 (2013).
- 1349 63. Bell, R. L. *et al.* Gene expression changes in the nucleus accumbens of alcohol-
1350 preferring rats following chronic ethanol consumption. *Pharmacology*
1351 *Biochemistry and Behavior* **94**, 131–147 (2009).
- 1352 64. Chaudhury, D. *et al.* Rapid regulation of depression-related behaviours by control
1353 of midbrain dopamine neurons. *Nature* **493**, 532–536 (2013).
- 1354 65. Cornish, J. L. & Kalivas, P. W. Glutamate Transmission in the Nucleus
1355 Accumbens Mediates Relapse in Cocaine Addiction. *J. Neurosci.* **20**, RC89–
1356 RC89 (2000).
- 1357 66. Simmler, L. D. *et al.* Blockade of the 5-HT transporter contributes to the
1358 behavioural, neuronal and molecular effects of cocaine. *British Journal of*
1359 *Pharmacology* **174**, 2716–2738 (2017).
- 1360 67. Poulin, J.-F., Gaertner, Z., Moreno-Ramos, O. A. & Awatramani, R.
1361 Classification of Midbrain Dopamine Neurons Using Single-Cell Gene
1362 Expression Profiling Approaches. *Trends in Neurosciences* **43**, 155–169 (2020).
- 1363 68. Su, Y. *et al.* Neuronal activity modifies the chromatin accessibility landscape in
1364 the adult brain. *Nat Neurosci* **20**, 476–483 (2017).
- 1365 69. Tsai, S.-Y. A. *et al.* Sigma-1 receptor mediates cocaine-induced transcriptional
1366 regulation by recruiting chromatin-remodeling factors at the nuclear envelope.
1367 *Proceedings of the National Academy of Sciences* **112**, E6562–E6570 (2015).
- 1368 70. Mesa, K. R. *et al.* Homeostatic Epidermal Stem Cell Self-Renewal Is Driven by
1369 Local Differentiation. *Cell Stem Cell* **23**, 677–686.e4 (2018).
- 1370 71. Chen, Q. *et al.* Chromatin Liquid–Liquid Phase Separation (LLPS) Is Regulated
1371 by Ionic Conditions and Fiber Length. *Cells* **11**, 3145 (2022).
- 1372 72. Eder, A. & Bading, H. Calcium signals can freely cross the nuclear envelope in
1373 hippocampal neurons: somatic calcium increases generate nuclear calcium
1374 transients. *BMC Neuroscience* **8**, 57 (2007).
- 1375 73. Lüscher, C. & Janak, P. H. Consolidating the Circuit Model for Addiction. *Annu.*
1376 *Rev. Neurosci.* **44**, 173–195 (2021).
- 1377 74. Reiff, S. B. *et al.* The 4D Nucleome Data Portal as a resource for searching and
1378 visualizing curated nucleomics data. *Nat Commun* **13**, 2365 (2022).
- 1379 75. Langmead, B. & Salzberg, S. L. Fast gapped-read alignment with Bowtie 2. *Nat*
1380 *Methods* **9**, 357–359 (2012).
- 1381 76. Quinlan, A. R. & Hall, I. M. BEDTools: a flexible suite of utilities for comparing
1382 genomic features. *Bioinformatics* **26**, 841–842 (2010).
- 1383 77. Szabó, D., Franke, V., Winick-Ng, W. & Pombo, A. Extended supplementary
1384 data for manuscript: A single dose of cocaine rewires the 3D genome structure of
1385 midbrain dopamine neurons. <https://doi.org/10.5281/zenodo.10528545>.

- 1386 78. Lieberman-Aiden, E. *et al.* Comprehensive Mapping of Long-Range Interactions
1387 Reveals Folding Principles of the Human Genome. *Science* **326**, 289–293 (2009).
1388 79. Buske, F. A., Bodén, M., Bauer, D. C. & Bailey, T. L. Assigning roles to DNA
1389 regulatory motifs using comparative genomics. *Bioinformatics* **26**, 860–866
1390 (2010).
1391 80. Bailey, T. L. & Grant, C. E. *SEA: Simple Enrichment Analysis of Motifs*.
1392 <http://biorxiv.org/lookup/doi/10.1101/2021.08.23.457422> (2021)
1393 doi:10.1101/2021.08.23.457422.
1394 81. Barbieri, M. *et al.* Complexity of chromatin folding is captured by the strings and
1395 binders switch model. *Proceedings of the National Academy of Sciences* **109**,
1396 16173–16178 (2012).
1397 82. Chiariello, A. M., Annunziatella, C., Bianco, S., Esposito, A. & Nicodemi, M.
1398 Polymer physics of chromosome large-scale 3D organisation. *Sci Rep* **6**, 29775
1399 (2016).
1400 83. Fiorillo, L. *et al.* Comparison of the Hi-C, GAM and SPRITE methods using
1401 polymer models of chromatin. *Nat Methods* **18**, 482–490 (2021).
1402 84. Kremer, K. & Grest, G. S. Dynamics of entangled linear polymer melts: A
1403 molecular-dynamics simulation. *The Journal of Chemical Physics* **92**, 5057–5086
1404 (1990).
1405 85. Conte, M. *et al.* Polymer physics indicates chromatin folding variability across
1406 single-cells results from state degeneracy in phase separation. *Nat Commun* **11**,
1407 3289 (2020).
1408 86. Plimpton, S. Fast Parallel Algorithms for Short-Range Molecular Dynamics.
1409 *Journal of Computational Physics* **117**, 1–19 (1995).
1410 87. Rippe, K. Making contacts on a nucleic acid polymer. *Trends in Biochemical*
1411 *Sciences* **26**, 733–740 (2001).
1412 88. Dekker, J., Rippe, K., Dekker, M. & Kleckner, N. Capturing Chromosome
1413 Conformation. *Science* **295**, 1306–1311 (2002).
1414 89. Bystricky, K., Heun, P., Gehlen, L., Langowski, J. & Gasser, S. M. Long-range
1415 compaction and flexibility of interphase chromatin in budding yeast analyzed by
1416 high-resolution imaging techniques. *Proceedings of the National Academy of*
1417 *Sciences* **101**, 16495–16500 (2004).
1418 90. Liao, Y., Wang, J., Jaehnig, E. J., Shi, Z. & Zhang, B. WebGestalt 2019: gene set
1419 analysis toolkit with revamped UIs and APIs. *Nucleic Acids Research* **47**, W199–
1420 W205 (2019).
1421 91. Riemondy, K. A. *et al.* valr: Reproducible genome interval analysis in R. Preprint
1422 at <https://doi.org/10.12688/f1000research.11997.1> (2017).
1423 92. Dale, R. K., Pedersen, B. S. & Quinlan, A. R. Pybedtools: a flexible Python
1424 library for manipulating genomic datasets and annotations. *Bioinformatics* **27**,
1425 3423–3424 (2011).
1426 93. Durinck, S., Spellman, P. T., Birney, E. & Huber, W. Mapping identifiers for the
1427 integration of genomic datasets with the R/Bioconductor package biomaRt. *Nat*
1428 *Protoc* **4**, 1184–1191 (2009).
1429 94. Zhang, H., Wang, F., Kranzler, H. R., Anton, R. F. & Gelernter, J. Variation in
1430 regulator of G-protein signaling 17 gene (RGS17) is associated with multiple
1431 substance dependence diagnoses. *Behavioral and Brain Functions* **8**, 23 (2012).
1432 95. Tan, G., Polychronopoulos, D. & Lenhard, B. CNER: A toolkit for exploring
1433 extreme noncoding conservation. *PLOS Computational Biology* **15**, e1006940
1434 (2019).

- 1435 96. Walker, D. M. *et al.* Cocaine Self-administration Alters Transcriptome-wide
1436 Responses in the Brain's Reward Circuitry. *Biological Psychiatry* **84**, 867–880
1437 (2018).
- 1438 97. Savell, K. E. *et al.* A dopamine-induced gene expression signature regulates
1439 neuronal function and cocaine response. *Science Advances* **6**, eaba4221 (2020).
- 1440 98. Fernandez-Albert, J. *et al.* Immediate and deferred epigenomic signatures of in
1441 vivo neuronal activation in mouse hippocampus. *Nat Neurosci* **22**, 1718–1730
1442 (2019).
- 1443 99. Gao, P., Limpens, J. H. W., Spijker, S., Vanderschuren, L. J. M. J. & Voorn, P.
1444 Stable immediate early gene expression patterns in medial prefrontal cortex and
1445 striatum after long-term cocaine self-administration. *Addiction Biology* **22**, 354–
1446 368 (2017).
- 1447 100. Uhl, G. R. *et al.* Cocaine reward is reduced by decreased expression of receptor-
1448 type protein tyrosine phosphatase D (PTPRD) and by a novel PTPRD antagonist.
1449 *Proceedings of the National Academy of Sciences* **115**, 11597–11602 (2018).
- 1450 101. Wurmus, R. *et al.* PiGx: reproducible genomics analysis pipelines with GNU
1451 Guix. *GigaScience* **7**, giy123 (2018).
- 1452 102. Dobin, A. *et al.* STAR: ultrafast universal RNA-seq aligner. *Bioinformatics* **29**,
1453 15–21 (2013).
- 1454 103. Zerbino, D. R. *et al.* Ensembl 2018. *Nucleic Acids Research* **46**, D754–D761
1455 (2018).
- 1456 104. Germain, P.-L., Lun, A., Meixide, C. G., Macnair, W. & Robinson, M. D.
1457 Doublet identification in single-cell sequencing data using *scDbtFinder*. Preprint
1458 at <https://doi.org/10.12688/f1000research.73600.2> (2022).
- 1459 105. Barkas, N. *et al.* Joint analysis of heterogeneous single-cell RNA-seq dataset
1460 collections. *Nat Methods* **16**, 695–698 (2019).
- 1461 106. Butler, A., Hoffman, P., Smibert, P., Papalexi, E. & Satija, R. Integrating single-
1462 cell transcriptomic data across different conditions, technologies, and species. *Nat*
1463 *Biotechnol* **36**, 411–420 (2018).
- 1464 107. McInnes, L., Healy, J. & Melville, J. UMAP: Uniform Manifold Approximation
1465 and Projection for Dimension Reduction. Preprint at
1466 <https://doi.org/10.48550/arXiv.1802.03426> (2020).
- 1467 108. Aibar, S. *et al.* SCENIC: single-cell regulatory network inference and clustering.
1468 *Nat Methods* **14**, 1083–1086 (2017).
- 1469 109. muscat. *Bioconductor* 10.18129/B9.bioc.muscat.
- 1470 110. Gu, Z., Eils, R. & Schlesner, M. Complex heatmaps reveal patterns and
1471 correlations in multidimensional genomic data. *Bioinformatics* **32**, 2847–2849
1472 (2016).
- 1473 111. Alves dos Santos, M. T. & Smidt, M. P. En1 and Wnt signaling in midbrain
1474 dopaminergic neuronal development. *Neural Development* **6**, 23 (2011).
- 1475 112. Galter, D., Buervenich, S., Carmine, A., Anvret, M. & Olson, L. ALDH1 mRNA:
1476 presence in human dopamine neurons and decreases in substantia nigra in
1477 Parkinson's disease and in the ventral tegmental area in schizophrenia.
1478 *Neurobiology of Disease* **14**, 637–647 (2003).
- 1479 113. Margolis, E. B., Coker, A. R., Driscoll, J. R., Lemaître, A.-I. & Fields, H. L.
1480 Reliability in the Identification of Midbrain Dopamine Neurons. *PLOS ONE* **5**,
1481 e15222 (2010).
- 1482

1483 **Extended Data Figures**

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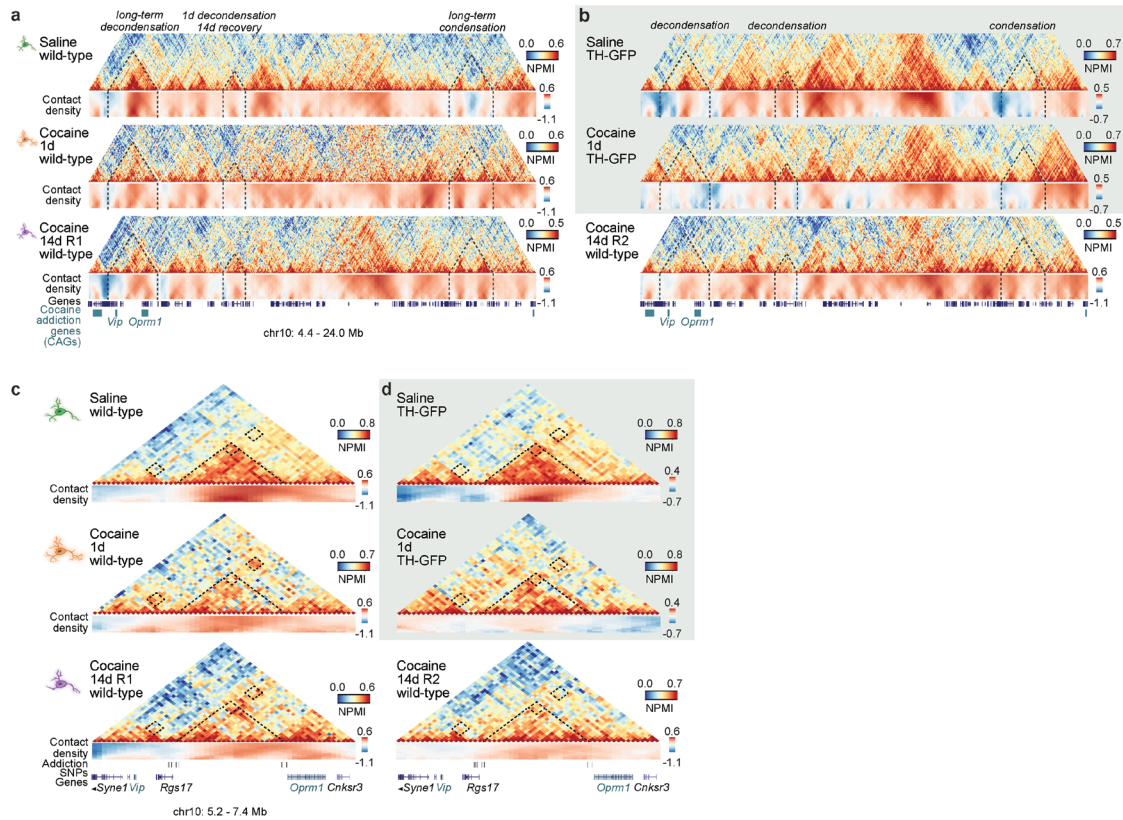
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Extended Data Figure 1. Quality control of immunoGAM and single-nucleus RNA-seq data.

a, Quality control (QC) measurements (uniquely mapped reads, genome coverage, percentage of orphan windows) for all combined GAM samples collected from ventral tegmental area (VTA) dopamine neurons (DNs). Each data point represents a GAM sample: Green, sample passed QC; Red, sample did not pass QC; Black, water control. **b**, Similar to **a** but shown separately for each dataset produced in this study (number of uniquely mapped reads and percentage of orphan windows). **c**, Summary of GAM data used in this study. All data was collected from 8-week-old mice, 1 or 14 days following an intraperitoneal injection of cocaine (15 mg/kg). GAM data from saline-treated animals were littermates with cocaine-treated animals and was previously published¹⁰. **d**, Percentage of loci-pairs detected at least once, as well as Kendall's τ (Tau) coefficients for different GAM resolutions (range 30 - 250 kb) and a range of distance cutoffs (2 Mb - chromosome-wide). We considered a Tau value > 0.95 as an appropriate resolution for a given genomic distance. **e**, Flow cytometry data of a representative sample showing selection criteria for gating of neuronal cells using NeuN (RBFOX-3) as a pan-neuronal marker. **f**, Total number of sequenced nuclei per library. **g**, Distribution of number of detected features (genes) per library. **h**, Number of nuclei classified as singlet / doublet / undefined by the scDblFinder¹⁰⁴ doublet detection algorithm. **i**, Distribution of the log₂ ratio of exonic to intronic reads for

1506 each detected feature in each sample. In panels **f - i** cDNA libraries from biological
1507 replicates 1 and 2 from 1 day saline and cocaine treatments were prepared using the
1508 10x chromium single cell V2 chemistry, while all other samples were prepared with
1509 V3 chemistry (V3 samples are shown inside the black-bounded box). Our conclusion
1510 was that the replicates produced with V2 chemistry were of lower quality, and
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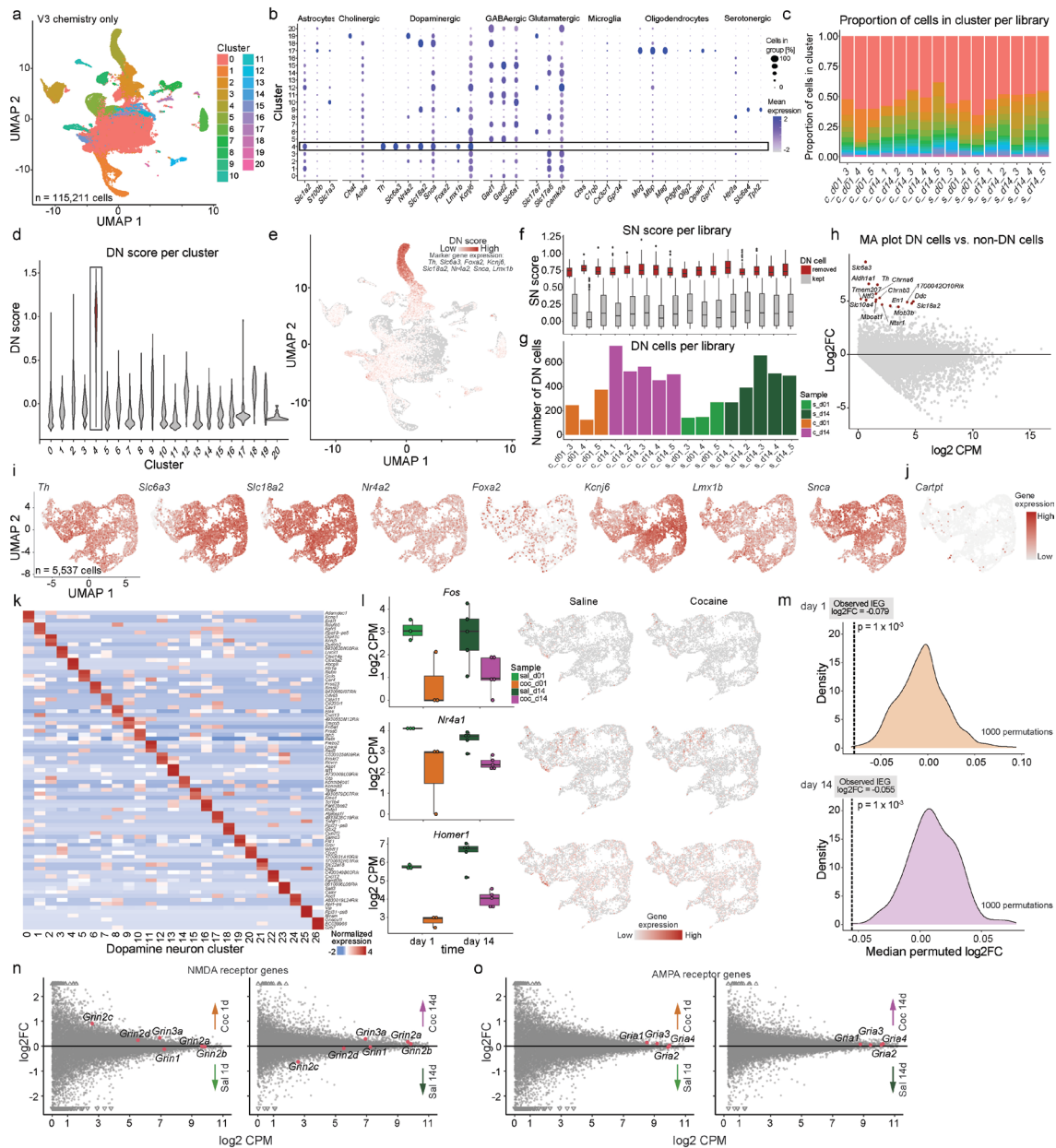
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Extended Data Figure 2. Cocaine induced large-scale disruption of 3D genome structure in GAM replicates.

a, Similar to **Fig. 1c** but with both cocaine 14 day GAM replicates shown side-by-side. Example of long-term cocaine-induced 3D genome reorganization (chr10: 4.4 - 24 Mb; 40 kb windows). NPMI, normalized pointwise mutual information. Contact density heatmaps show insulation scores ranging from 240-1040 kb. **b**, GAM matrices produced from VTA DNs in TH-GFP animals display similar condensation and decondensation of the highlighted loci 1d after cocaine exposure, though broad contact loss is not as pronounced as in wild-type animals. **c**, Similar to **Fig. 1d** but with both cocaine 14d replicates shown side-by-side. Example of cocaine-induced disruption and rewiring of local contacts seen in both 14-day replicates (chr10: 5.2 - 4.4 Mb; 40 kb resolution). **d**, Similar interaction patterns and rewiring of chromatin contacts after cocaine exposure are observed in GAM data produced from VTA DNs of TH-GFP animals.

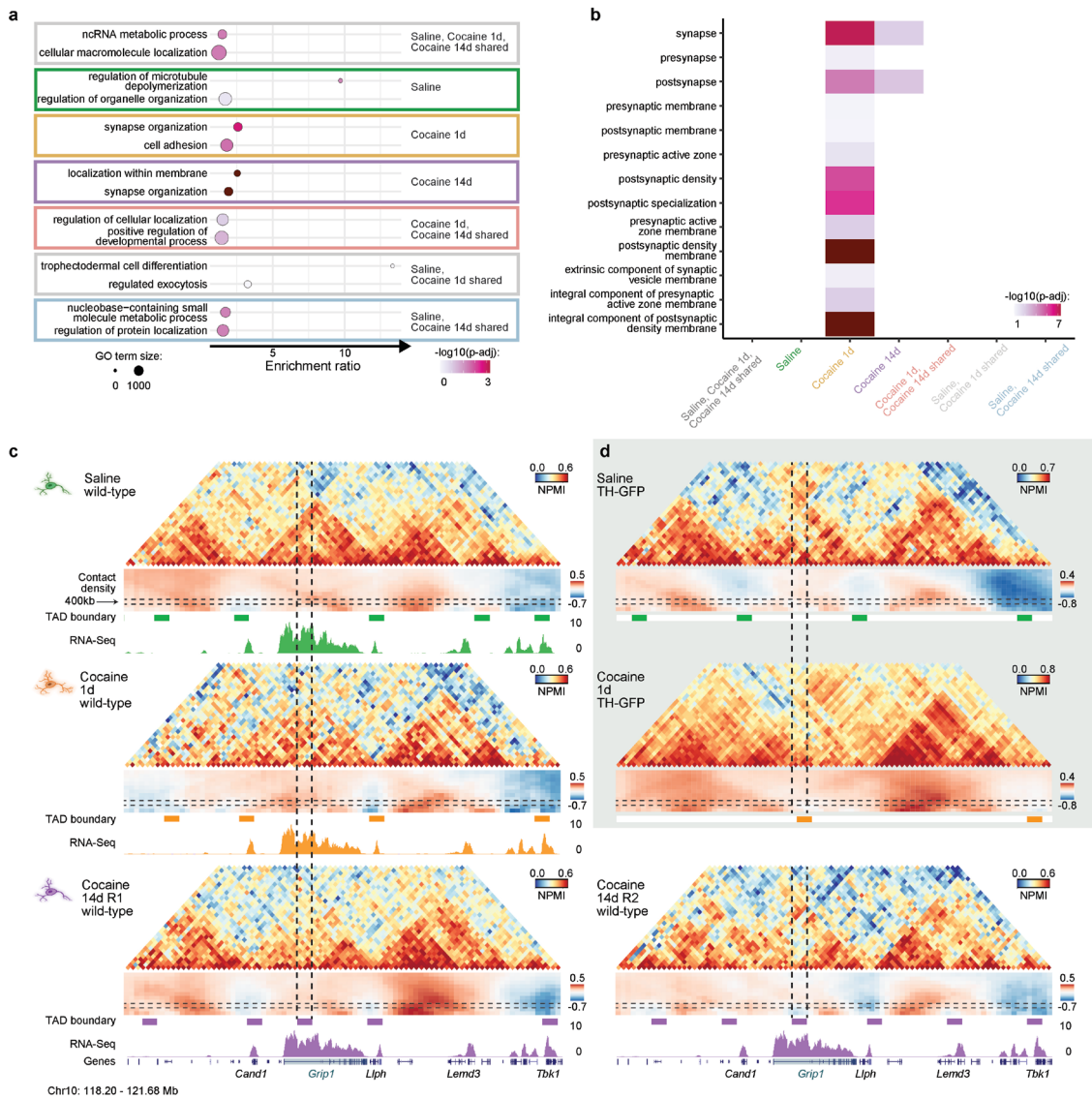


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Extended Data Figure 3. Identification and characterization of VTA dopamine neurons.

a, UMAP representation of the complete dataset integrated using the Conos algorithm¹⁰⁵. Sample libraries prepared with 10x chromium single cell V2 chemistry (see **Extended Data Fig. 1f-i**) were excluded from the integration and downstream analyses. **b**, Expression of brain cell type marker genes in the integrated clusters. **c**, Relative abundance of cell-types captured in each library. **d**, Distribution of the DN gene set score, in each cluster, of a set of known dopaminergic specific genes obtained using the AddModuleScore function from the Seurat package. Nuclei belonging to cluster 4 were classified as putative dopaminergic nuclei (grey box). **e**, Dopaminergic gene set score overlaid on top of the UMAP representation. **f**, Distribution of gene set score of known substantia nigra (SN) markers in the putative dopaminergic nuclei in each sample. Cells with a SN score greater than 0.65 were classified as putative SN cells and removed from further analyses. **g**, Number of dopaminergic nuclei per sample. **h**, MA plot showing the average expression and log₂ fold change of VTA DNs versus non-DN cells. Top genes differentially upregulated in dopaminergic cells are well known DN markers *Th*, *Aldh1a1*, and *En1*¹¹¹⁻¹¹³. **i**, Normalized gene expression of

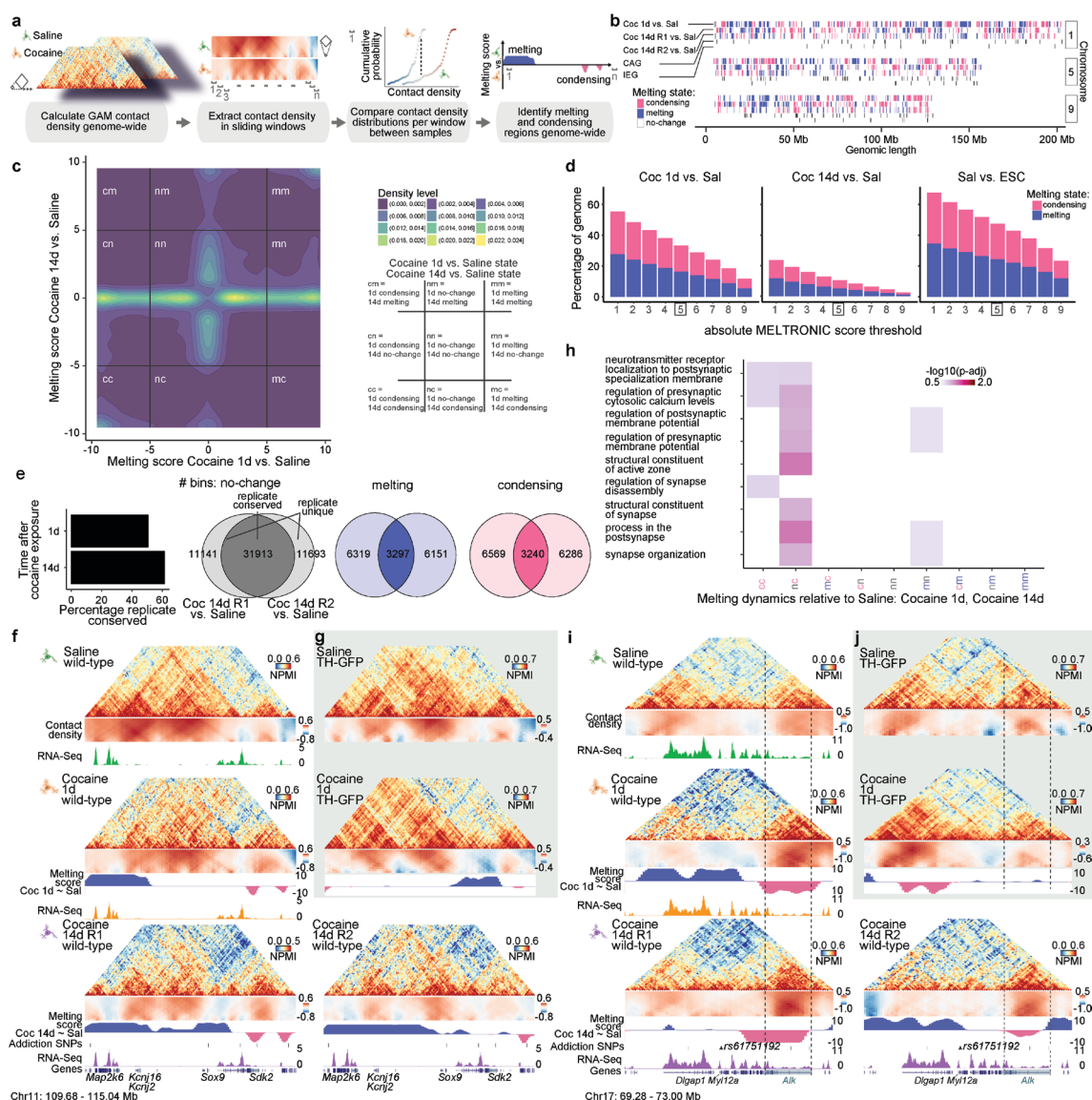
1546 known dopaminergic marker genes overlaid on the UMAP representation. **j**,
1547 Normalized expression of cocaine response gene *Cartpt*. **k**, Heatmap showing the
1548 scaled average gene expression of the top three marker genes in each of the VTA
1549 dopaminergic clusters. **l**, Example expression of a selection of IEGs (*Fos*, *Nr4a1*,
1550 *Homer1*), related to **Fig. 1g**. Each point shows the average log₂ DN pseudobulk
1551 transcription of the gene in one replicate of the corresponding condition. The related
1552 integrated DN UMAPs represent the expression of the IEG genes in the saline and
1553 cocaine conditions for each gene. **m**, Results of the gene set permutation analysis. The
1554 density plot shows the distribution of the median fold changes of equal sized
1555 randomized gene sets. The dotted vertical line shows the median fold change of the
1556 IEG gene set (n = 139). **n and o**, MA plots showing the log₂ fold change ratio of
1557 cocaine and saline pseudo-bulk RNAseq samples versus the average expression of
1558 each gene. Colored dots indicate the average transcription level and the fold change of
1559 NMDA receptors in **n** and AMPA receptors in **o**. For **f** and **l**, boxplot whisker length
1560 represents 1.5 times the interquartile range.



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Extended Data Figure 4. Cocaine-induced TAD boundaries are enriched for synapse related genes.

a, Similar to **Fig. 2b** but for all groups found in **Fig. 2a**. A complete list of gene ontology (GO) terms can be found in **Supplementary Table 10**. **b**, Similar to **Fig. 2c** but for all groups found in **Fig. 2a**. Synaptic gene ontology (SynGO) enrichments were only found for boundaries specific to 1 or 14 days after cocaine. A complete list of synGO terms can be found in **Supplementary Table 10**. **c**, Similar to **Fig. 2d** but with both cocaine 14d GAM replicates shown side-by-side. *Grip1* overlaps a 14-day specific boundary in both biological replicates (coloured boxes below contact density heatmap; chr10: 118 – 122 Mb). **d**, *Grip1* locus in GAM data produced from VTA DN in TH-GFP animals. The saline-treated mouse with TH-GFP background is similar to wild-type. However, contact reorganization 1 day after cocaine result in a new TAD boundary at the *Grip1* locus in the TH-GFP animal, not seen in the wildtype mouse.

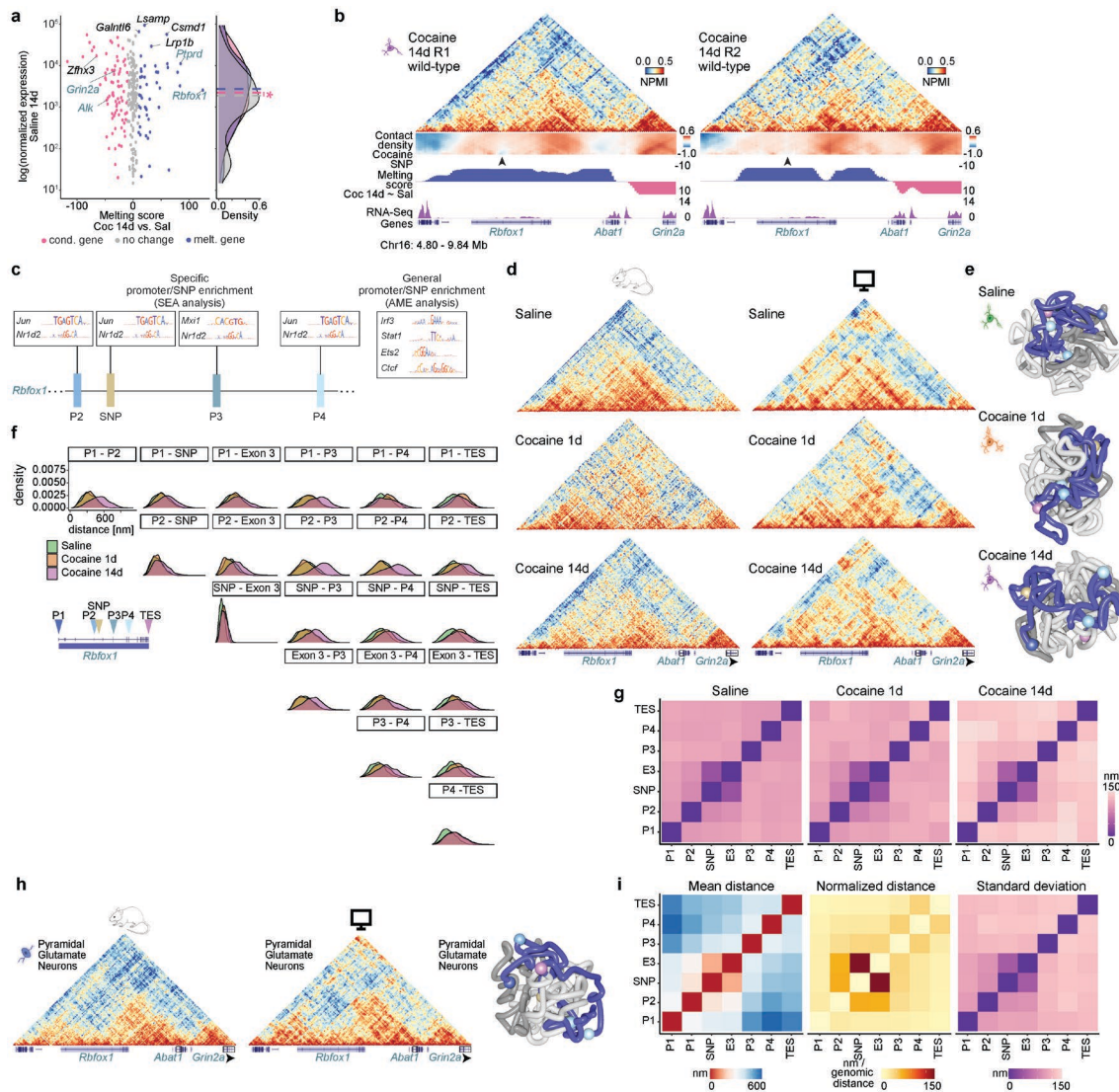


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Extended Data Figure 5. MELTRONIC discovers extensive chromatin melting and condensing after a single cocaine exposure genome-wide.

a, The MELTRONIC pipeline was applied genome-wide between cocaine- and saline-treated DNs. Contact density value distributions (ranging 240 - 1040 kb) of cocaine-treated DNs were compared to saline-treated DNs in 120 kb sliding windows with a one-sided Kolmogorov–Smirnov test, and visualized as a cumulative probability distribution function. 40 kb genomic bins with a melting score > 5 or < -5 were identified as melting or condensing, respectively (corresponding to a multiple testing corrected $P < 1 \times 10^{-5}$). **b**, Linear version of **Fig. 2e** of representative example chromosomes. Condensing (pink, melting score < -5), melting (blue, melting score > 5) and non-changing (white) regions in cocaine 1 day vs. Saline (top row), cocaine 14 days R1 vs. saline (2nd row), and cocaine 14 days R2 vs. Saline (3rd row) comparisons. The positions of cocaine addiction genes (CAGs) and immediate early genes (IEGs) are shown below. **c**, Two-dimensional representation of melting score densities in replicate-reproducible bins from the cocaine 14 day R1 vs. saline comparison (y-axis) and cocaine 1 day vs. saline comparison (x-axis). Melting/condensing thresholds (5 and -5, respectively) are indicated as solid black lines. For visualization purposes, bins with melting scores > -1 and < 1 in both comparisons were removed. **d**, Assessment of melting score thresholds in the cocaine 1 day vs. saline comparison (left), cocaine 14 day vs. saline (middle; for bins where

1597 melting or condensing was reproducible in both replicates), and saline-treated DNs vs.
1598 ESCs. The percentage of the genome identified as melting or condensing decreases
1599 near linearly with the threshold. The percentage of melting/condensing regions
1600 identified by a given threshold is higher between cell types than between treatments.
1601 **e**, Histogram (left) showing the percentage of genomic regions found with the same
1602 melting state in the cocaine replicates. Venn plots (right) show the replicate overlap for
1603 non-melting, melting, and condensing regions. **f**, Similar to **Fig. 2f** but with both
1604 cocaine 14-day GAM replicates shown side-by-side, showing melting of *Kcnj16* and
1605 *Kcnj2*, and condensing downstream of *Sox9*, in both 14 day replicates (chr11: 110 -
1606 115 Mb). **g**, The *Kcnj16/Kcnj16* locus is similar in a saline-treated mouse with TH-
1607 GFP background. In contrast with the wildtype mouse, melting of the *Kcnj2/Kcnj16*
1608 genes is not detected in the TH-GFP background mice, while the region downstream of
1609 *Sox9* has both melting and condensing regions. **h**, SynGO enrichments ($p\text{-adj} < 0.05$)
1610 of biological processes were identified for genes encoded in short-term melting and
1611 long-term condensing regions. A complete list of synGO terms can be found in
1612 **Supplementary Table 10**. **i**, Long-term condensation of the *Alk* gene both 1 and 14
1613 days after a single cocaine exposure (chr17:69.28-73.00 Mb). *Alk* condenses in both 14
1614 day replicates, though more distinctly in R1. The upstream region, containing a
1615 putative cocaine addiction SNP (rs61751192) and the *Dlgap1* gene, melts 1 day after
1616 exposure, then returns to its pre-melted state in cocaine 14-day R1, but not R2.
1617 **j**, Similar to wildtype, the *Alk* region condenses, while the cocaine addiction SNP and
1618 the *Dlgap1* region melts, 1 day following cocaine in the TH-GFP mouse.

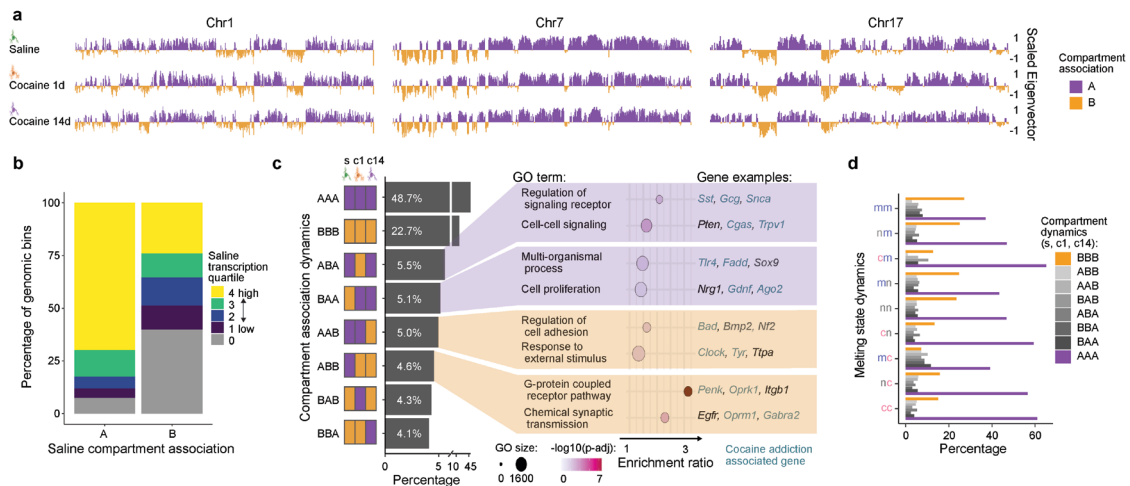


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Extended Data Figure 6. Melting of the *Rbfox1* gene becomes progressively stronger after cocaine exposure.

a, Similar to Fig. 3B, but for melting scores 14 days after cocaine exposure. Condensing is associated with higher baseline (saline) transcription (one-sided Wilcoxon signed rank test, $*P = 0.05$). **b**, Log₂ fold change (log₂FC) distributions of melting, condensing and non-changing genes 1d after cocaine exposure. **c**, Log₂FC distributions of melting, condensing and non-changing genes 14 days after cocaine exposure. n.s., not significant. For **b** and **c**, boxplot whisker length represents 1.5 times the interquartile range. **d**, Similar to Fig. 3c but also includes the second 14-day cocaine replicate. Melting can be seen across the gene in both GAM replicates, with the strongest melting at a putative cocaine SNP (arrowhead). **e**, Enrichment of immediate early gene and circadian TFBS motifs for the *Rbfox1* putative SNP and nearby promoters (P2, P3 and P4; enrichment +/- 500kb around the feature) using Simple Enrichment Analysis (SEA) or Analysis of Motif Enrichment (AME). Full result table can be found in **Supplementary Table 9**. **f**, Similar to Fig. 3d but for an additional example polymer, showing looping out of the TES and full gene decondensation 1 and 14 days after cocaine, respectively. **g**, GAM matrices from the *Rbfox1* region (chr16: 4.80 - 9.81 Mb, 30 kb resolution) compared to *in-silico* GAM reconstructed matrices from the ensemble of polymers ($n=1100$ for each condition) after modeling (Pearson $r = 0.65, 0.56$ and 0.64 for saline, cocaine 1 day and cocaine 14 days, respectively). **h**, Density estimates of pairwise distances at the *Rbfox1* gene

1641 across 1100 polymer models in saline, cocaine 1- and 14-day conditions. Multiple
1642 pairwise distances show increased contacts after cocaine exposure, most pronounced
1643 by 14 days. **i**, The variability of measured distances between the *Rbfox1* gene features
1644 are increased after cocaine exposure with highest values measured after 14 days. **j**,
1645 Similar to **Extended Data Fig. 6f, g**, but modeling from PGNs (n=1100, Pearson
1646 r=0.65, GAM data from¹⁰). **k**, Similar to **Fig. 3e, f** and **Extended Data Fig. 6j**
1647 showing the average distance, normalized linear distance, and distance variation
1648 between *Rbfox1* promoters, the putative SNP, SNP-proximal exon and TES for PGNs.
1649 The models, distances and variability were most similar to DNPs 14 days following
1650 cocaine treatment.



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Extended Data Figure 7. Compartment dynamics after a single cocaine exposure.

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a, Linear representation of scaled eigenvector values and compartment associations of

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representative chromosomes at 250 kb resolution. The full list of eigenvector values

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and compartment associations can be found in **Supplementary Table 8**. **b**, 67% of all

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genomic bins assigned to the A compartment after saline treatment contain at least one

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highly expressed gene, while B compartments most frequently contain non-expressed

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genes (42%). **c**, Frequency of compartment switches between saline, cocaine 1 and 14

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day wild-type samples. Compartment regions that change following cocaine exposure

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(4.1 - 5.5% of bins) contain genes with functions in synaptic signalling. A complete

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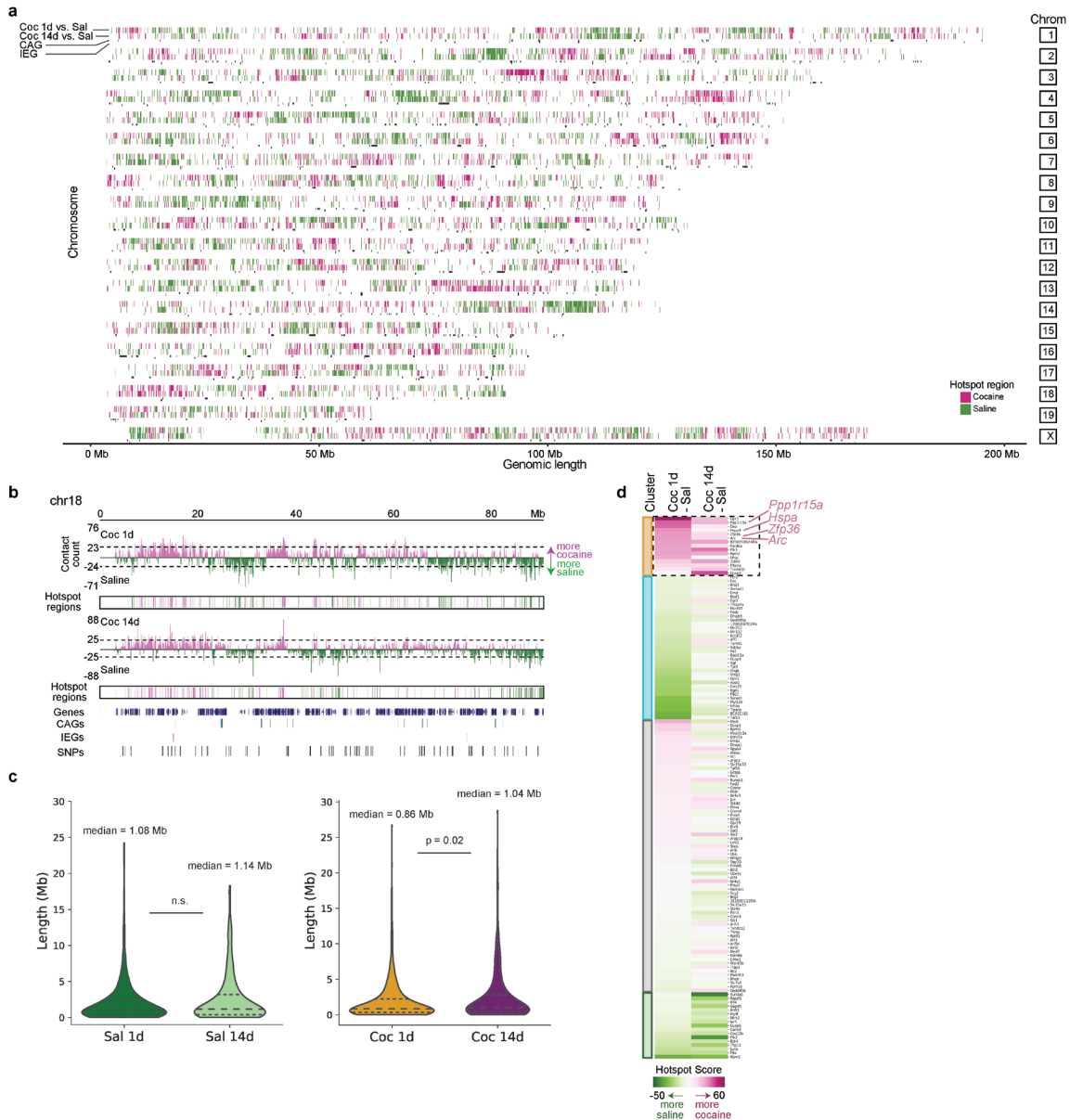
list of gene ontology (GO) terms can be found in **Supplementary Table 10**. **d**, Most

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melting or condensing regions do not change compartment classification following 1

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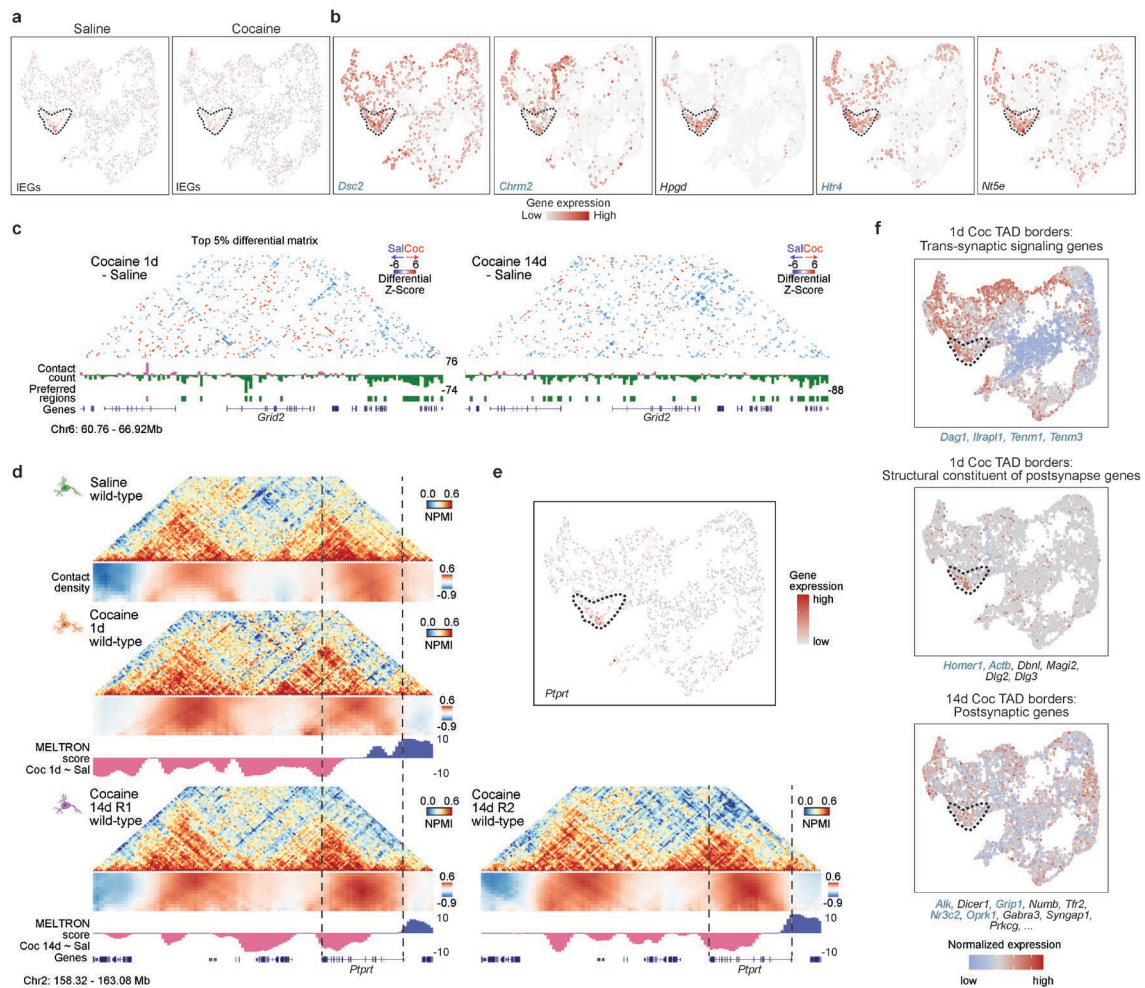
or 14 days of cocaine exposure.



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Extended Data Figure 8. Hotspots of differential contacts are clustered in the genome and propagate during the cocaine response.

a, Linear version of Fig. 4c showing cocaine (pink) and saline (green) hotspots across all chromosomes. **b**, Differential contact count per genomic window, hotspot thresholds (indicated with the dashed line), and preferred contact regions (hotspots) for chromosome 18. **c**, Genomic lengths of contiguous hotspots, calculated as the number of genomic windows containing a hotspot from a given treatment before encountering a hotspot from the other treatment. Saline hotspots were longer than 1 day cocaine hotspots (two-sided Mann Whitney U-test, $P = 0.02$), with no difference between saline and 14-day cocaine hotspots. **d**, Heatmap of hotspot scores for cocaine 1 or 14 days, compared to saline. Clustering of IEGs by hotspot score shows a group of IEGs with high hotspot scores both 1 and 14 days after cocaine. Example genes are labelled pink.



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Extended Data Figure 9. Immediate early genes and cocaine addiction associated genes are preferentially expressed in a specific DN subcluster.

a, Similar to **Fig. 5b**, except showing the entire DN UMAP. The IEG group had the highest expression in the identified cluster (dashed lines) in saline treatment, which was lower after cocaine exposure. **b**, Related to **Fig. 5c**, example UMAPs of IEG cluster marker genes. All genes were highly expressed in the IEG cluster (dashed lines), with some marker genes expressed in other clusters. **c**, Related to **Fig. 5d**, example region containing the *Grid2* gene (chr6: 60.76 – 66.92 Mb), showing strong saline-specific contacts (differential matrix) and hotspots (tracks below matrix) compared to both 1 and 14 days after cocaine. **d**, Example region containing the *Ptptr* gene (chr2: 158.32 - 163.08 Mb), showing melting at the gene TSS, and condensing at the gene TES, both 1 and 14 days after cocaine exposure. **e**, UMAP of *Ptptr* expression shows high expression in the IEG cluster. **f**, Similar to **Fig. 5e**, except showing additional synGO gene ontology groups of genes found in cocaine-specific TAD boundaries with high expression in the IEG cluster.

1705 **Captions for Supplementary Videos 1 to 8**

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1707 **Supplementary Video 1. *Rbfox1* example polymer 1 in saline conditions.** Rotating
1708 3D-image of the example polymer shown in **Fig. 3d**.

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1710 **Supplementary Video 2. *Rbfox1* example polymer 2 in saline conditions.** Rotating
1711 3D-image of the example polymer shown in **Extended Data Fig. 6f**.

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1713 **Supplementary Video 3. *Rbfox1* example polymer 1, 1 day after cocaine exposure.**
1714 Rotating 3D-image of the example polymer shown in **Fig. 3d**.

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1716 **Supplementary Video 4. *Rbfox1* example polymer 2, 1 day after cocaine exposure.**
1717 Rotating 3D-image of the example polymer shown in **Extended Data Fig. 6f**.

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1719 **Supplementary Video 5. *Rbfox1* example polymer 1, 14 days after cocaine**
1720 **exposure** Rotating 3D-image of the example polymer shown in **Fig. 3d**.

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1722 **Supplementary Video 6. *Rbfox1* example polymer 2, 14 days after cocaine**
1723 **exposure.** Rotating 3D-image of the example polymer shown in **Extended Data Fig.**
1724 **6f**.

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1726 **Supplementary Video 7. IEG expressing dopamine neurons localize along the**
1727 **entire midline of the VTA.** Rotating 3D-image of the IEG DN cluster mapped to
1728 single-cell MERFISH data shown in **Fig. 5g**.

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1730 **Supplementary Video 8. *Vip* expressing dopamine neurons localize along the**
1731 **dorsal midline of the VTA.** Rotating 3D-image of the *Vip* DN cluster mapped to
1732 single-cell MERFISH data shown in **Extended Data Fig. 10d**.

1733 **Tables**

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1735 **Supplementary Table 1.** Genomic coordinates of immediate early genes (IEGs) and
1736 cocaine addiction genes (CAGs).

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1738 **Supplementary Table 2.** Marker genes of dopamine neuron subpopulations in the
1739 ventral tegmental area (VTA)

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1741 **Supplementary Table 3.** Differential gene expression table of ventral tegmental area
1742 dopamine neurons from mice treated with cocaine vs. saline treated controls.

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1744 **Supplementary Table 4.** Position of topologically associating domain (TAD)
1745 boundaries in individual samples and sample comparisons.

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1747 **Supplementary Table 5.** MELTRONIC scores and MELTRON scores of long genes.

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1749 **Supplementary Table 6.** Differential contact count and hotspot locations.

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1751 **Supplementary Table 7.** Experimental, sequencing and QC metrics for GAM
1752 samples.

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1754 **Supplementary Table 8.** Compartment eigenvector (EV) values and A/B
1755 classification for GAM datasets.

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1757 **Supplementary Table 9.** Transcription factor binding motif enrichment results at the
1758 Rbfox1 locus.

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1760 **Supplementary Table 10.** Full list of enriched gene ontology (GO) terms and
1761 associated genes.