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Outer membrane 1 pore protein prediction in mycobacteria using genomic comparison

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1	Outer membrane pore protein prediction in
2	mycobacteria using genomic comparison

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- 14
- 15 Running title: outer membrane pore protein prediction in mycobacteria
- 16
- 17 Contents category: Research Paper (Microbial Pathogenicity)
- 18
- 19 Abbreviations: OMP, outer membrane protein; Mt, Mycobacterium tuberculosis; Mb,
- 20 Mycobacterium bovis; Ml, Mycobacterium leprae; Mu, Mycobacterium ulcerans; Ms,
- 21 Mycobacterium smegmatis, Ma, Mycobacterium avium; Mm, Mycobacterium
- 22 *marinum*, aa, amino acid; TM, transmembrane helix
- 23

24 Summary

25 Proteins responsible for outer membrane transport across the unique membrane 26 structure of *Mycobacterium* spp. are attractive drug targets in the treatment of human 27 diseases caused by the mycobacterial pathogens, M. tuberculosis, M. bovis, M. leprae 28 and M. ulcerans. In contrast to E. coli, relatively few outer membrane proteins 29 (OMPs) have been identified in *Mycobacterium* spp., largely due to the difficulties in 30 isolating mycobacterial membrane proteins and our incomplete understanding of 31 secretion mechanisms and cell wall structure in these organisms. To further expand 32 our knowledge of these elusive proteins in Mycobacterium, we have improved upon 33 our previous method of OMP prediction in mycobacteria by taking advantage of 34 genomic data from seven mycobacteria species. Our improved algorithm suggests 35 4333 sequences as putative OMPs in these seven species with varying degrees of 36 confidence. The most virulent pathogenic mycobacterial species are slightly enriched 37 in these selected sequences. We present examples of predicted OMPs involved in 38 horizontal transfer and paralogy expansion. Analysis of local secondary structure 39 content allowed identifying small domains predicted to perform as OMPs; some 40 examples show their involvement in events of tandem duplication and domain 41 rearrangements. We discuss the taxonomic distribution of these discovered families 42 and architectures, often specific to mycobacteria or the wider taxonomic class of 43 Actinobacteria. Our results suggest that OMP functionality in mycobacteria is richer 44 than expected and provide a resource to guide future research of these understudied 45 proteins.

46 Introduction

47 Mycobacteria are responsible for some of the most terrible human diseases including
48 leprosy and tuberculosis (Cosma *et al.*, 2003). However, not all mycobacteria are

- 2 -

49	pathogenic to humans despite their considerable genomic similarity. Part of their
50	variable properties in infective ability and specificity are likely related to their
51	variable cell wall (Brennan & Nikaido, 1995). Outer membrane proteins (OMPs) are
52	an important component of the mycobacterial cell wall, yet they are poorly studied in
53	mycobacteria (Niederweis et al., 2010). OMPs are transmembrane proteins that form
54	a beta-barrel structure consisting of amphipathic beta strands and are secreted into the
55	periplasmic space and inserted into the outer membrane to act as channels (Faller et
56	al., 2004). This type of protein is therefore an important target for antibacterial
57	therapy and an object of study to the elucidation of the mechanisms of pathogenicity
58	(Niederweis, 2008). However, currently there is evidence of just some mycobacterial
59	OMPs, in large degree for MspA (Stahl et al., 2001), and less for another two Mt
60	proteins: Rv1973 (Song et al., 2008) and Rv1698 (Siroy et al., 2008; Song et al.,
61	2008). This is not only due to the difficulties of culturing mycobacteria, but also to the
62	difficulty of identifying these proteins.
63	
64	Computational methods of OMP detection have been developed and applied to
65	Mycobacterium tuberculosis with relative success (Pajon et al., 2006; Song et al.,
66	2008), but there is room for improvement, especially when it comes to prioritizing
67	targets for research. The increasing number of related mycobacterial genomes offers a
68	unique opportunity to support the predictions by addressing their coherence across
69	orthologs and to pinpoint OMP families specific to pathogenic mycobacteria.
70	
71	In this work we accomplished parameter optimization of a previous method that
72	predicts OMPs based solely on their potential to be secreted and to form an

73 amphiphilic beta-barrel (Song *et al.*, 2008). We explored the predictive power of a set

- 3 -

74	of OMP-related properties by contrasting the robustness of the results on the complete
75	proteomes for seven mycobacteria: three obligate pathogens M. tuberculosis, M. bovis
76	and M. leprae, two facultative pathogens M. marinum and M. ulcerans, one
77	opportunistic pathogen M. avium, and the non-pathogenic M. smegmatis.
78	
79	The relatedness between these species and their pathogenic properties are
80	heterogeneous. The closest genomes by far are those of <i>M. tuberculosis</i> and <i>M. bovis</i> ,
81	but their host ranges are different (M. bovis can cause tuberculosis in several
82	mammals, whereas the natural hosts of <i>M. tuberculosis</i> are humans). Therefore, both
83	genomes were included in the analysis since we considered that a comparison of
84	OMPs between these two species can lead to insights that help to explain the
85	differences in ability to infect different hosts.
86	
87	The predictions on these seven genomes directed us to a number of OMP domains
88	present in mycobacteria, most of them exclusive to actinobacteria and without
89	homologs in eukaryotes.

90 Methods

91	Calculation of parameters for outer membrane protein prediction in
92	mvcobacteria

93 Protein sequences were obtained for seven mycobacterial genomes (Table 1)

94 [ftp://ftp.ncbi.nlm.nih.gov/genomes/Bacteria/], including: *Mycobacterium avium* 104,

- 95 Mycobacterium bovis AF2122/97, Mycobacterium leprae TN, Mycobacterium
- 96 marinum M, Mycobacterium smegmatis str. MC2 155, Mycobacterium tuberculosis
- 97 H37Rv, and Mycobacterium ulcerans Agy99. All proteins were predicted to be OMPs
- 98 based on the two main properties: 1) the ability to be secreted to the outer membrane;
- and 2) the ability to form beta-barrel structures.

100

101	Secreted proteins were predicted according to both classical secretion mechanisms
102	(SignalP-v3.0) and non-classical secretion such as twin arginine translocation (TatP-
103	v1.0) or leaderless secretion (SecretomeP-v1.0) (Bendtsen et al., 2004a; Bendtsen et
104	al., 2004b; Bendtsen et al., 2005). Prediction of classically secreted proteins is well-
105	studied and most secreted bacterial proteins are exported in this manner (Malen et al.,
106	2007); therefore predictions determined by SignalP-v3.0 algorithm or the presence of
107	a single predicted transmembrane alpha helix in the first 70 aa of protein (TMHMM;
108	(Krogh et al., 2001)) were considered to be superior to other prediction methods. TatP
109	prediction is specific to bacteria and was considered to be next most reliable.
110	SecretomeP prediction was the least specific of all methods, but was still considered
111	to be useful as we are aiming for high recall.
112	To demonstrate the efficacy of the secretion prediction methods, the algorithms were
113	run on positive and negative validation sets. A set of 53 experimentally verified,
114	classically secreted mycobacterial proteins was obtained from Leversen and co-
115	workers (Leversen et al., 2009). A set of non-classically secreted mycobacterial
116	proteins, including proteins secreted by Tat or SecA2 systems, was assembled by
117	literature search. Negative controls for secretion were represented by 1725 reviewed
118	cytoplasmic proteins from Mycobacterium sp. (UniProtKB release 15.3).
119	
120	In the second step of the OMP prediction, the propensity of the proteins to form beta-
121	barrel structures was determined using various beta-strand properties. Secondary
122	structure for all proteins was predicted using Jnet v1.0 (Cuff & Barton, 1999; Cuff &
123	Barton, 2000). Beta-strands of 5 or more residues (B5 strands) were evaluated for
124	amphiphilicity (FracB5) as previously described (Song et al., 2008). As additional

- 5 -

125 measures of 'betaness', the overall proportion of residues in beta strands

126 (PercentBeta), the number of B5 strands (numB5) and the total number of residues in 127 B5 strands (numB5res) were recorded. Positive and negative control sets for beta-128 barrels were used to demonstrate the utility of these parameters to predict beta-barrel 129 structure. Positive validation of beta-barrel structure was represented by 428 bacterial 130 and eukaryotic sequences taken from proteins containing Pfam motifs or bacterial 131 sequences with solved 3D structures annotated as forming a beta-barrel. Negative 132 validation of beta sheet prediction consisted of 90 actinobacterial proteins with solved 133 3D structure of low beta content. Protein structures were obtained from the Protein 134 Data Bank (PDB, www.pdb.org). 135 136 Additional parameters, including the number of cysteine residues (numcys) and the 137 isoelectric point (pI) (BioPerl pICalculator, www.bioperl.org) were also evaluated. 138 Initial OMP prediction (Method 1) was carried out with similar parameters and 139 thresholds as previously used by Song et al. (Song *et al.*, 2008), namely: FracB5 \geq 140 0.19, PercentBeta \geq 0.10, Smean (from the signal peptide predictor SignalP) \geq 0.50 or 141 numpredhel (number of predicted transmembrane helices) = 1 and firsthel (position in 142 amino acids of the most N-terminal predicted transmembrane helix) ≤ 70 143 (Supplementary Table S1). Here, the OMP prediction method was further refined by 144 using sequence homology information and optimization of the algorithm as described 145 below.

146 **Clustering of Mycobacterial sequences**

147 Clustering of the seven mycobacterium genomes listed in Table 1 was carried out

- 148 using a very strict sequence similarity criterion that enforces all proteins in a cluster to
- 149 be homologous along their full lengths, ensuring their domain content and

- 6 -

150 architectures are equivalent (Perez-Iratxeta et al., 2007). About 1% of the sequences

151 were not used because they were too short (< 50 aa). The remaining sequences

152 (30,605) were distributed into 11,633 clusters. Pfam motif information (Finn *et al.*,

153 2008) of representative members of the clusters was retrieved to further characterize

154 them.

155 **Optimization of OMP prediction**

156 To optimize the OMP prediction, two training sets of clusters (with at least five

157 sequences each) were defined: 1) OMP-rich clusters which contained \geq 80% OMP-

158 predicted sequences (1151 sequences in 168 clusters); and 2) OMP-poor clusters,

159 which contained $\leq 20\%$ OMP-predicted sequences (981 sequences in 96 clusters).

160 First, optimization was carried out by applying varying thresholds for OMP prediction

161 on parameters that were not included in Method 1, namely pI, sequence length,

162 number of cysteines, numB5, numB5res, Tat-secretion score, and leaderless secretion

score. Next, the Method 1 thresholds on parameters including frac, PerBeta, and

164 Smean were optimized. The optimal cutoff values were defined to be those that most

165 reduced the fraction of predicted OMPs in OMP-poor clusters while retaining over

166 90% of the predicted OMPs in OMP-rich clusters. The new set of optimized criteria

167 was called Method 2 and used for the remainder of the analysis.

168

A scoring system (producing a score ranging from zero to 16) was used to indicate theconfidence of the OMP prediction. Propensity for secretion and beta-barrel formation

171 were given equal weight (maximum of 8 points each). Proteins predicted to be

172 secreted by general secretion or Tat mechanisms were awarded 8 points. In the

absence of these two predictions, proteins were awarded 3 points if the SecretomeP

174 score ≥ 0.574 . Beta-sheet related parameters were assessed on: 1) the entire protein

- 7 -

175 length; and 2) within a 300 aa sliding window of protein sequence to detect local 176 regions of high beta content. A window size of 300 aa was chosen because this is the 177 size of the beta barrel domain in some known OMP structures (Faller et al., 2004; 178 Song *et al.*, 1996); however, such domains can be formed by association of beta 179 strands from multiple protein monomers, and it can happen that an OMP protein or 180 region is much smaller than 300 aa. One point was awarded for each of the following 181 criteria satisfied as frac ≥ 0.28 , PerBeta ≥ 0.11 , numB5 ≥ 3 , numB5res ≥ 17 , for a 182 maximum of 8 points.

183 **Results**

184 **Optimization of OMP prediction**

185 To optimize our predictions in seven mycobacterial genomes, we clustered their

186 protein sequences and evaluated the fraction of proteins in each cluster predicted as

187 OMP (see Methods). Contrasting the parameters of OMP-rich and OMP-poor clusters

188 enabled us to further refine the OMP criteria, based on the assumption that all proteins

189 in a cluster should be predicted either as being OMPs or not; and therefore, that OMP-

190 poor clusters indirectly reflected false positives.

191

192 In the first instance, we tested nine parameters that could play a minor role in the

193 initial prediction of OMPs but were not previously used. The fraction of OMP

194 predicted sequences in OMP-rich and OMP-poor groups was monitored when

applying increasingly restrictive thresholds in each of these nine parameters

196 (Supplementary Fig. S1). Four parameters (pI, number of cysteines, first helix, dvalue

197 score from TatP) showed little improvement in reducing the number of potential false

198 negatives in the OMP-poor group of clusters. Potential improvements could be made

199 for the remaining five parameters: sequence length, number of residues in B5 sheets,

- 8 -

number of B5 sheets, number of predicted TM helices, and nnscore (prediction ofleaderless score from SecretomeP).

202

203	Sequence length was rejected as a constraining factor, as it was undesirable to
204	eliminate short (~100 aa) predicted OMPs potentially composing homologous
205	multimeric structures. Requiring the number of B5 sheets and the number of residues
206	in B5 sheets to be a minimum of 3 and 17, respectively, was successful in reducing
207	the number of OMPs in the OMP-poor clusters by $>10\%$, while keeping 96% of the
208	OMPs in the OMP-rich clusters (Supplementary Fig. S1). A rather stringent threshold
209	was used for prediction of leaderless secretion. At nnscore $>= 0.71$, 56% of sequences
210	from the OMP-rich clusters were retained, while rejecting 74% of sequences from the
211	OMP-poor clusters as targets for leaderless secretion. This was not considered to be
212	overly stringent, since proteins with signal sequences, (which would be identified by
213	SignalP-3.0 or TatP-1.0) were likely to have a high nnscore anyway (Bendtsen et al.,
214	2004a).

215

216 In the second instance, the five parameters initially used to predict OMPs were varied 217 and the fraction of predicted OMPs was recorded. This analysis suggested fine 218 adjustments in the cutoff values for amphiphilicity (frac), proportion of residues in 219 beta strands (perbeta), and general secretion score (Smean) (Supplementary Fig. S2). 220 The optimized criteria were applied to the dataset, expanding the number of predicted 221 OMPs, compared to the original method (Tables 1 and Supplementary Table S1). Up 222 to this point, the optimization had been carried out by varying parameters on an 223 individual basis. A scoring system was implemented to summarize the effect of all the 224 optimized parameters (with 8 points for beta-barrel formation and 8 points for

-9-

secretion, see Methods). Assuming that most of the sequences in OMP-rich clusters
should actually be OMPs, and that sequences in OMP-poor clusters should not be
OMPs, a threshold of OMP score = 12 to accept an OMP prediction was found to be
optimal (Fig. 1; Supplementary Fig. S3(a)). At this threshold, 94% of sequences from
OMP-rich clusters are classified as OMPs, while 89% of the sequences in the OMPpoor clusters are rejected as OMPs.

231 Validation of signal sequence and beta-barrel prediction in mycobacteria

232 None of the secretion prediction programs were specifically designed to predict signal

233 sequences in *Mycobacterium* spp., although the SignalP neural net predictions were

234 based on Gram-positive bacteria, and the TatP server was trained on both Gram-

235 negative and Gram-positive sequences. Mycobacteria are classified as Gram-positive,

236 despite the fact that the mycobacterial outer membrane has distinct properties not

237 found in either functionally classified Gram-negative nor Gram-positive bacteria (Hett

238 & Rubin, 2008). Therefore, it was important to test these algorithms for their ability to

239 detect signal sequences in mycobacteria.

240

Using known cytoplasmic and known mycobacterial proteins secreted by the general secretory pathway, it could be shown that the optimized cutoff (Smean = 0.54) was sufficient to correctly predict secretion in 93% of the known GSP proteins and reject 98% of the cytoplasmic proteins (Supplementary Fig. S3(b)). Secretion by the nonclassical Tat system could be predicted at a cutoff of dvalue = 0.36 in 79% of the known Tat-secreted mycobacterial sequences, while rejecting 98% of the cytoplasmic proteins for secretion (Supplementary Fig. S3(c)).

248

- 10 -

249	Prediction of leaderless secretion in mycobacteria at the chosen cutoff nnscore ≥ 0.71
250	correctly identified 50% (6/12) known leaderless secreted proteins (Supplementary
251	Fig. S3(d)), which included secreted proteins by the recently described bacterial
252	export system ESX-1 and the SecA2 (Sec-independent) system. 81% of the known
253	cytoplasmic proteins were predicted as being secreted in this instance, making the
254	leaderless secretion prediction the least precise of all three secretion prediction
255	methods. As a result, less emphasis was placed on leaderless secretion scores in the
256	OMP prediction.
257	Prediction of beta-barrel structures was based on beta-sheet content and the
258	amphiphilicity of predicted beta strands (computed as in (Song et al., 2008)). As a
259	measure of the protein's propensity to form beta-barrel structures, beta-barrel scores
260	were calculated globally (over whole protein) and locally (sliding window) for a
261	maximum score of 8 (see Methods). For a beta-barrel score \geq 6, a total of 97% of
262	known bacterial OMP and 90% of annotated beta-barrel proteins were correctly
263	identified as containing beta-barrels, whereas non beta-barrel structures were
264	predicted in 74% of solved sequences lacking certain beta-barrel structure (Fig. 2).
265	
266	After the optimization stage, Method 2 was able to correctly identify 90% (27/30) of
267	known bacterial OMPs with high scores (score ≥ 14 ; Supplementary Fig. S4)
268	corresponding to strong predictions. Among the three OMPs missed by Method 2,
269	there were two from <i>Rhodobacter</i> spp. Although one of them (PORI_RHOBL)
270	contained sufficient beta structure for a beta-barrel, it was predicted to be secreted by
271	leaderless secretion resulting in a weak OMP prediction (OMP score = 11). OmpG
272	from <i>E. coli</i> was as well not identified as OMP by this method, due to a lack of beta-
273	strand prediction from Jnet v1.0.

- 11 -

274

275	The selection criteria of both the optimized Method 2 and the previous method show
276	substantial differences between the results (Supplemental Table S1). When applying
277	them to seven mycobacterial genomes (see Methods) 3340 proteins are predicted to be
278	OMPs by both methods. A total of 993 proteins are newly predicted by Method 2
279	whereas 406 proteins predicted to be OMPs by Method 1, are now rejected as false
280	positives.
281	Identification of OMPs
282	Table 1 specifies the number of sequences and predicted OMPs. The seven genomes

- analysed have a genomic size in the 4000-5000 range except for the small MI genome
- 284 (1605 genes, an extreme case of genome downsizing (Cole *et al.*, 2001)) and the

285 larger Ms (6,716 genes). When considering the percentage of predicted OMPs it is

- 286 interesting to note that the three obligate pathogenic organisms (Mt, Mb, and Ml)
- have the largest percentage (15.1 -15.8%) while the opportunistic pathogen Ma and
- the non-pathogenic species Ms have the lowest values (12.5 -12.6%).
- 289
- 290 We showcase the results of our method with some examples of newly OMP-predicted
- 291 mycobacterial proteins. Because the taxonomic distribution of a protein can give an
- 292 indication of its functional relevance, we have categorized the examples by this
- 293 property. Our selection of examples was facilitated by the clustering used for the
- 294 optimization of the method, e.g. when searching for OMPs present in all seven
- 295 mycobacteria. The complete results are available in Supplementary Table S2.

296 **OMPs present in Mt but not in Mb**

Though Mt and Mb are very closely related (they both belong to the Mycobacterium
tuberculosis complex – Mt complex) and share many 100% identical proteins, they

- 12 -

have obvious differences regarding pathogenicity. It is therefore interesting to find
OMPs in Mt that have no equivalent in Mb. Two outstanding examples are Mt
proteins mce3c (Rv1968; 410 aa) and mce3e (Rv1970; 377 aa) encoded by two of six
genes from the putative mce3 operon Mce3A-F. Both Mce3C and Mce3E proteins
were found to react with antibodies from serum of TB patients (Ahmad *et al.*, 2004)
and have one predicted MCE domain each (at positions 38-114 and 36-112,
respectively).



- 321 gene loss (as in the massive pseudogenization that occurred in the Ml genome (Cole *et*
- 322 *al.*, 2001)). Here we show examples of each of those.

323 An OMP unique to Mt/Mb

Rv1351 is a Mt 109 aa protein that we predict to be an OMP. The	e Mb ortholog is
---	------------------

- 325 100% identical, and there are no homologous sequences in the other five
- 326 mycobacteria analysed in this work, or outside mycobacteria (no PSIBLAST hits with
- 327 E-value below 8.3). We also predict that the gene next to it, Rv1352 (encoding a 123
- 328 aa protein), is also a small OMP. According to the STRING database (Jensen *et al.*,
- 329 2009), these two predicted OMPs are in an operon conserved between Mt/Mb, which
- includes upstream genes Rv1348 and Rv1349 (two uncharacterized ABC transporter
- 331 ATP-binding proteins) and fabG2/Rv1350 (predicted as 3-ketoacyl-(acyl-carrier-
- 332 protein) reductase). Therefore, these two predicted OMPs seem to form part of an
- 333 Mt/Mb specific operon and although they are rather small they could form a barrel by
- multimerization, which would explain the need to co-express them in an operon. Such
- 335 operon could carry out a function inherent to the Mt complex. The three genes,
- Rv1348, Rv1349 and Rv1350, are essential genes for growth of Mt as determined by
- 337 Sassetti et al. (Sassetti *et al.*, 2003).

338 A mycobacterial OMP with horizontal transfer

- 339 Mt Rv1914c (135 aa) is predicted as an OMP with orthologs in Mb/Mu/Mm but
- 340 without apparent equivalents in Ml/Ma/Ms. Curiously, the only match in the database
- 341 outside mycobacteria is a very clear hit (>50% identity) on a distant bacteria,
- 342 Proteobacteria Geobacter uraniireducens (sequence GI:148265072, 135 aa). This
- 343 suggests an event of horizontal transfer of this gene between mycobacteria and
- 344 geobacteria. One could speculate that the function of this OMP would not be
- 345 associated to pathogenicity given its presence both in pathogenic and non-pathogenic
- 346 mycobacteria (and in *G. uraniireducens*). Incidentally, Rv1914c was one of 224 genes
- 347 found to be deleted in one or more clinical isolates of a H37Rv strain from San
- 348 Francisco (Tsolaki et al., 2004).

349 **C4:** a novel putative OMP domain that occurs as a tandem repeat.

350 Mt Rv2270 (175 aa) defines a family with orthologs in five of seven mycobacteria

- 351 tested (missing in Ms/Ml) and corynebacteria. This implies that the gene was invented
- in Corynebacterineae and that there was a selective loss of this gene within some
- 353 members of the mycobacteria lineage indicating that it is not essential for them.
- 354
- 355 Sequence analysis indicated that the family contains a C-terminal 120 aa domain (that
- 356 we termed C4 for its conserved four cysteines, see Supplementary Fig. S5), which is
- 357 present in other two protein families, one where the domain is tandemly repeated
- 358 (with orthologs in all seven mycobacteria, e.g. Mt Rv3835), and another where it is
- 359 combined with an N-terminal Ser/Thr Kinase C domain (present exclusively in a
- 360 series of Actinomycetales species, e.g. Stackebrandtia nassauensis GI:229864975,
- 361 577 aa; see Supplementary Fig. S5).
- 362 The prediction of Mt Rv2270 as containing a lipoprotein anchor signal may invalidate
- the OMP function, but the predicted C4 domain has high beta content and high
- amphiphilicity; its involvement in variable domain architectures suggests that it can
- 365 be used as a biological module.

366 **Present in all seven mycobacterial genomes**

367 We found a total of 588 clusters with sequences from all seven mycobacteria, and 61

- 368 of these were predicted as OMP families. These families are likely to represent
- 369 proteins important for all mycobacteria but possibly not for pathogenicity since they
- are present both in pathogenic and in non-pathogenic organisms. We present two
- interesting cases below.

372 ACT: an actinobacteria OMP domain greatly expanded in Corynebacterineae

- 373 Rv0431 is an Mt predicted OMP with orthologs in all seven mycobacteria. Sequence
- analysis indicated that the family contains a C-terminal domain of about 100 aa (that

we name ACT for the names given to the proteins where it is present: Alanine rich,
CpsA, Tuberculin related) present in five Mt sequences that define five families (see
Supplementary Fig. S6). In three of the five families the ACT domain is preceded by
a predicted domain of around 170 aa of unknown function (PFAM LytR_cpsA_psr).

- 380 The ACT domain is present in some genera outside but close to mycobacteria, chiefly
- 381 Nocardiodes and Corynebacterium, but not all species have the five sequences and
- 382 Ma has an extra copy of one of the five. These results suggest that the ACT domain
- 383 was invented before the divergence of mycobacteria, corynebacteria and nocardiodes.
- 384 Its high level of duplication and a number of gene losses and duplications in
- 385 mycobacteria suggest that it confers some kind of low-specific functional advantage.

386 An OMP essential for Mycobacteria growth

- 387 Rv0227c is another predicted OMP in a cluster with orthologs in all seven
- 388 mycobacterial genomes. The proteins in this cluster have no known function, and
- 389 closer analysis by PSI-BLAST revealed that there are distant homologs in nocardia
- 390 and corynebacteria. The protein itself is characterized by a by a signal peptide with a
- 391 predicted cleavage point before the first TM helix and a 300 aa beta-domain
- 392 surrounded by two TMs. Mutagenesis and comparative genomic analyses have
- 393 identified Rv0227c as being a 'core' mycobacterial gene, required for optimal growth
- 394 (Marmiesse *et al.*, 2004; Sassetti *et al.*, 2003).

395 Example OMPs identified by new criteria

- 396 Method 2 includes two predictive features that have not been used before: export
- 397 signals other than those reported by SignalP and a window analysis of secondary
- 398 structure. Those allowed the identification of many extra OMPs respect to our

399 previous work. Here we present two examples of OMPs detected by each of these

400 new criteria.

401 An actinobacteria-specific protein with low global beta content

- 402 One of our clusters represents a family with members in five of the mycobacteria
- 403 tested, four of which have OMP scores of 15 (Rv2345, MAV2041, Mb2374,
- 404 MMAR_3652; ~660 aa) and one with an OMP score of 13 (MSMEG_4484). Notably
- 405 absent are sequence homologs in Ml and Mu (confirmed using PSI-BLAST under
- 406 default parameters), but we found orthologs of this protein in a wide range of
- 407 Actinobacteria. These proteins contain a predicted Pfam domain of unknown function
- 408 (DUF477), followed by a predicted TM, and a very variable glycine-rich region at the
- 409 end. The percentage of beta structure of the whole sequence is well below the
- 410 threshold of 0.11 that we use for selection. However, the window analysis shows that
- 411 the DUF447 domain has a high percentage of beta content and high amphiphilicity,
- 412 potentially characterizing an OMP function (Fig. 3).
- 413
- 414 Similarity searches uncovered a much shorter second homolog in Ma (MAV_2102),
- 415 also present in *M. intracellulare*, which keeps the N-terminal domain, the predicted
- 416 TM following it, and a C-terminal domain, but lacks the middle region and the
- Glycine-rich region (Fig. 3). We predict that both the long and the short families areOMPs.

419 Mycobacteria-specific OMPs secreted by the Tat system

An example found using the predicted Tat-system secretion that would not have been
detected using SignalP was Rv2577 from Mt. This is an OMP predicted protein with
orthologs in Mm and Ma (all of them with maximum OMP score = 16), apparently
absent from Mu and Ml. The C-terminal end contains a predicted

424 metallophosphoesterase domain (similarity to COG1409 Predicted phosphohydrolases
425 according to database annotations) with clear homologs to other species outside
426 actinobacteria.

427

428	In Mb AF2122/97, the syntenic gene of Rv2577 (529 aa) is separated into two open
429	reading frames (Mb2607 and Mb2608) due to a base transversion (G-A), which
430	introduces a stop codon. Mb2607 (83 aa) contains the signal sequence and sufficient
431	beta strand structure for an OMP prediction of perfect score. Mb2608 (434 aa)
432	matches Rv2577 from position 96 on, so that just 12 amino acids of the Mt protein are
433	not represented in any of the two Mb proteins. The complete predicted
434	phosphoesterase domain is intact. The N-terminal region has high content of potential
435	amphiphilic beta-strand but this extends further to the region of homology to Mb2608.
436	In the absence of sequences with homology to Mb2607 but not to Mb2608, we cannot
437	support that Mb2607 can form an independent domain, although the gene split
438	suggests this possibility.
439	
440	Both Mb2607/Mb2608 transcripts have been shown to be up-regulated in a virulent
441	strain of <i>M. bovis</i> during bacterial replication in macrophages (Blanco et al., 2009).
442	The G-A transversion is absent in avirulent <i>M. bovis</i> strains used for human vaccine
443	development (Mycobacterium bovis BCG str. Tokyo 172, Mycobacterium bovis BCG
444	Pasteur 1173P2). The splitting of this gene may extend host-specific modular
445	functions of this protein in <i>M. bovis</i> AF2122/97, which is pathogenic to cattle
446	(Garnier et al., 2003).

- 18 -

447 **Discussion**

448 Outer membrane proteins (OMPs) act as gatekeepers to the external environment.

- 449 They are exposed as quorum sensors or acting in response to its environment, and are
- 450 likely to be essential for general survival of the cell. In pathogenic species, the
- 451 function of the OMPs may play important roles in host-cell interactions that enable
- 452 the persistence of mycobacterial infection. As such, OMPs are logical drug targets -
- 453 not only in tuberculosis and leprosy, but also in opportunistic infections in
- 454 immunocompromised patients, which in total kill millions of people world-wide every
- 455 year and are complicated by new problems like co-infection with HIV and resistance
- 456 to drugs (Meya & McAdam, 2007).
- 457
- 458 Existing computational methods to predict beta-barrel outer membrane proteins
- 459 primarily focus on known OMPs in Gram-negative bacteria (Berven et al., 2004;
- 460 Bigelow et al., 2004; Casadio et al., 2003; Remmert et al., 2009; Zhai & Saier, 2002).
- 461 Unfortunately, OMPs of the beta-barrel type are almost totally uncharacterized in
- 462 mycobacteria. Models for Gram-positive and Gram-negative OMPs can only partially
- 463 extend to mycobacteria due to its unique cell wall construction that eludes clear
- 464 functional classification as Gram-positive or Gram-negative. For example, the beta-
- 465 barrels of the OMPs of mycobacteria have to be longer than those typically known
- 466 from Gram-negative bacteria, in agreement with the greater thickness of the
- 467 mycobacterial wall (Alahari *et al.*, 2007; Hoffmann *et al.*, 2008; Zuber *et al.*, 2008);
- this is the case for MspA (Faller *et al.*, 2004). As a result, the study of mycobacterial
- 469 OMPs has to rely on tools specific to it.
- 470
- 471 Computational methods can be used to predict OMPs based on two properties: OMPs472 must form an amphipathic beta-barrel and be secreted. However, in view of the

- 19 -

473 current small number of mycobacterial OMPs with which to benchmark such
474 methods, and aware of the fact that mycobacterial OMPs are expected to be very
475 different to those known outside Actinobacteria, we resourced to benchmark our
476 method according to its ability to produce coherent predictions across proteins with
477 high similarity to Mt proteins.

478

479 Accordingly, the method we presented here uses clusters of homologous sequences 480 from seven mycobacterial genomes to optimize OMP prediction, based on the 481 assumption that cross-genomic sequences within the same cluster should share similar 482 properties, and therefore if the majority of sequences within a cluster were predicted 483 to be OMPs, then those sequences that escaped prediction were also likely to be OMP 484 sequences. In this manner, we were able to examine the effect of changing the 485 thresholds of different parameters on the number of predicted OMPs to set final 486 thresholds that reduced the number of spurious OMP predictions in clusters with low 487 OMP content while maintaining OMP predictions for clusters with initially high OMP 488 content. Moreover, we performed a sliding window analysis on all proteins to identify 489 local regions of beta-content within larger proteins with low overall propensity to 490 form beta-barrels. This method predicts practically all known mycobacterial OMPs 491 with close to maximum scores.

492

We computed a set of 4300 potential OMPs in seven genomes (+600 alone in Mt). It
is unlikely that all of them will be OMPs as current estimations of OMPs in Mt are in
the order of 100s (Niederweis *et al.*, 2010). We do not think that with the current
information on mycobacterial OMPs we can devise a more sensitive scoring system.
In any case we note that this dataset includes a higher proportion of sequences from

- 20 -

obligate pathogenic mycobacteria compared to opportunistic or non-pathogenic
mycobacteria (15% versus 13%) suggesting that the set is enriched in genes with a
function related to pathogenicity. Many of these proteins, as we have shown, define
families specific to Mycobacteria or Actinobacteria that remain yet to be functionally
characterized.

503

504 Our work proposes a number of putative OMP domains. Some of them are reused in 505 multiple domain architectures and duplicated in paralogs (e.g. the ACT domain) or 506 inside genes (e.g. the tandemly repeated C4 domain in Rv3835). Some of these 507 domains or even some of the entire OMP predicted proteins are probably too small to 508 form a beta-barrel by themselves (<150 aa). However, the many cases where such 509 proteins appear together in putative operons (e.g. the mce operons) suggest that they 510 may associate to form a barrel. OMP formation by oligomerization is already 511 suspected in the predicted OMP Rv1698. Rv1698 has been observed to dimerize and 512 the observation that channel complexes containing Rv1698 have variable conductance 513 states suggest that Rv1698 might form oligomers (Siroy et al., 2008). The formation 514 of self-associations is also a possibility that has been reported. For example, both Mt 515 MspA and the alpha-hemolysin porin of *Staphylococcus aureus* (from different 516 phylum firmicutes) form a beta-barrel with each monomer contributing just a 50 517 amino acids loop to the beta-barrel associating as homo-octamer (Faller et al., 2004) 518 or homo-heptamer (Song et al., 1996), respectively.

519 **Conclusions**

In summary, our results suggest that potential OMPs are a large contributor to the
protein baggage of mycobacteria, possibly of Actinobacteria. Should a large fraction
of our predictions be demonstrated experimentally to be OMPs, this would point to

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523 this function as an important factor for shaping the evolution, variability, and 524 adaptability of these organisms. Using genomic information we have been able to 525 tune an OMP prediction algorithm and produced a set of OMP predictions for more 526 than 4300 mycobacterial proteins. Their profiles of taxonomic conservation can be 527 used to hypothesize the functional importance and pathogenicity relevance. 528 529 We note that while this manuscript was under review, one of our predicted OMPs, 530 Rv0899, has been the focus of an experimental effort to characterize it as an OMP 531 (Teriete et al., 2010). Although the result was negative, this indicates that our method 532 produces targets that align well with those that the researchers in the field choose 533 using their intuition and knowledge. As new experimental evidence accumulates, we 534 will be able to refine our algorithm. In addition, the expected sequencing of novel 535 mycobacterial genomes will allow us to further complete the picture of the 536 evolutionary history of OMPs and to pinpoint their association to pathogenicity, 537 hopefully leading to new strategies to combat a number of terrible diseases. 538

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- 543

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709 **Tables**

710 **Table 1 - Predictions for seven genomes.**

Genome (NCBI Taxon ID)	Habitat	Annotated proteins	Suggested OMP proteins with score >=12 (% of total)	Suggested OMPs unique to a genome*
Mycobacterium tuberculosis H37Rv (83332)	obligate pathogen	3991	629 (15.8 %)	35
Mycobacterium bovis AF2122/97 (233413)	obligate pathogen	3920	617(15.7%)	39
Mycobacterium leprae TN (272631)	obligate pathogen	1605	242 (15.1%)	77
Mycobacterium marinum M (216594)	environmental, facultative pathogen	5462	799 (14.6%)	184
Mycobacterium ulcerans Agy99 (362242)	environmental, facultative pathogen	4160	561 (13.5%)	111
Mycobacterium smegmatis str. MC2 155 (246196)	environmental, not pathogenic	6716	844 (12.6 %)	459
Mycobacterium avium 104 (243243)	environmental, facultative opportunistic pathogen	5120	641 (12.5%)	251
Total		30974	4333 (14%)	

* numbers of predicted OMPs in within clusters in other genomic patterns: present in

all genomes: 189; present only in obligate pathogens (Mt, Mb, Ml): 48; present only

713 in facultative pathogens (Mm, Mu, Ma): 66; all other combinations: 2874

716 Figure legends

- 717 Fig. 1 OMP scores for sequences in OMP-rich and OMP-poor clusters.
- The minimum score for OMP prediction was set to ≥ 12 (dotted vertical blue line).
- 719 At this threshold, 94% of sequences from OMP-rich clusters (black line) are classified
- as OMPs, while 85% of the sequences in the OMP-poor clusters (red line) are rejected
- as OMPs.

722 Fig. 2 - Beta-barrel prediction scores for control sequences.

- 723 Positive controls for beta-barrels include 428 bacterial or eukaryotic proteins from
- 724 Pfam or PDB with annotated beta-barrel structures and solved structure information.
- 725 Negative controls include 90 actinobacterial sequence fragments with low beta
- content, as determined from solved structures in PDB. At beta-barrel score $\geq 6,97\%$
- and 90% of known bacterial OMPs and annotated beta-barrels, respectively, are
- predicted to be beta-barrels, and 74% of low beta sheet content sequences are
- 729 predicted to be without beta-barrel structure.

730 Fig. 3 - Frac and PerBeta in a sliding window for Rv2345.

- 731 Rv2345 defines a family conserved in Actinobacteria and present in the mycobacteria
- tested with the exception of MI and Mu. Top: average on a 300 aa window of
- percentage of beta sheet (PercentBeta) and amphiphilicity of beta strands (FracB5) for
- Rv2345. The horizontal lines indicate the thresholds used for these two parameters.
- The plot suggests that the N-terminal of Rv2345 contains a highly amphiphilic beta
- structure. Bottom: the N-terminal end of Rv2345 and orthologs contains a predicted
- 737 Pfam domain of unknown function (DUF477). Ma protein MAV_102 represents a
- 738 different architecture but is potentially a shorter OMP as it keeps the N-terminal
- domain. Other predicted sequence features for these proteins are: transmembrane

- 740 helices (blue boxes), a 300 aa domain (blue hexagon), a C-terminal domain (yellow
- 741 oval), and a G-rich amino acid biased region (orange bar).

743 Supplementary material legends

744 Supplementary Fig. S1– Fraction of OMPs remaining with increased restriction

- 745 of non-Method 1 parameters.
- This figure shows the fractions of OMPs remaining (y-axis) from the OMP-rich (S1,
- solid line) and OMP-poor (S2, dotted line) groups of clusters, as the parameter
- 748 thresholds become increasingly restrictive (x-axis).

Supplementary Fig. S2- Effect of changing original parameters on OMP prediction in OMP-rich (S1) and OMP-poor (S2) clusters.

- 751 Cutoff criteria for the parameters frac, percent beta, and general secretion score
- (Smean) were varied and the fraction of predicted OMPs relative to the Method 1
- 753 prediction, was recorded. Optimal cutoffs (shown in red) eliminated 5-25% of the
- OMPs in S2 clusters while maintaining at least 94% of the OMPs in S1 clusters.

755

756 Supplementary Fig. S3– Validation of OMP prediction and signal sequence

- 757 prediction in mycobacteria.
- 758 (a) Recall-precision curve for predicted OMPs. This figure shows the recall and
- 759 precision curve, based on the assumptions that OMP-rich clusters (S1) contained true-
- positives and OMP-poor clusters (S2) contained true negatives. An OMP score of 12
- 761 was chosen as the threshold for an OMP prediction. (b) General secretion scores for
- 762 mycobacterial proteins. This figure shows the Smean scores, as determined from
- SignalP-v3.0, for 1723 cytoplasmic and 58 proteins known to be secreted by the
- 764 general secretion pathway. Cytoplasmic proteins were taken from annotated, reviewed
- 765 proteins in UniProtKB. Experimentally verified GSP secreted proteins were taken
- from the literature. Proteins with Smean≥0.54 (vertical dotted blue line) were
- considered to be secreted. At this cutoff, 93% of known GSP-secreted proteins are
- correctly predicted to be secreted, while 98% of the cytoplasmic proteins are not
- 769 predicted to be secreted. (c) Twin arginine translocation scores for mycobacterial
- proteins. In this figure, experimentally verified Mycobacterium proteins secreted by

782	Supplementary Fig. S4– OMP scores for known bacterial OMPs.
781	
780	to not be secreted.
779	predicted to be secreted. 81% of known cytoplasmic proteins were correctly predicted
778	protein (GLNA1_MYCTU), whose secretion mechanism is unknown, was not
777	includes 5/6 ESX-1 secreted proteins and 1/5 SecA2 secreted proteins. A single
776	(12) are correctly predicted to be secreted at nnscore ≥ 0.71 (SecretomeP-v1.0). This
775	mycobacterial sequences. In this figure, 50% of known leaderless secreted proteins
774	proteins were not predicted to be Tat-secreted. (d) Leaderless secretion prediction for
773	mycobacterial positive validation proteins to be Tat-secreted. 98% of the cytoplasmic
772	dvalue=0.36, vertical dotted blue line), the TatP algorithm correctly predicts 79% of
771	Tat system (19) were found by literature search. At the selected cutoff (TatP

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783 In this figure, each horizontal bar summarizes the points awarded to each bacterial

784 OMP (indicated by UniProtKB accession). Points were awarded for prediction of

785 secretion by signal sequence prediction (general or Tat secretion, 8 points; black bar)

786 or leaderless secretion (3 points; red bar). For the beta-barrel structure, one point was

787 awarded for 4 parameters (frac, perbeta, numB5, resB5) over the whole sequence

788 (green bar) or for a sliding window of 300 aa (blue bar), for a maximum of 8 beta-

789 barrel points.

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791 Supplementary Fig. S5- C4: a tandemly repeated OMP domain

792 We found a domain that occurs in Mt proteins Rv2770 and Rv3835, tandemly

793 repeated in the latter. In some Actinomycetales the domain occurs with a Ser/Thr

794 protein kinase catalytic domain at the N-terminal and a predicted TM helix in

795 between.

797 Supplementary Fig. S6- ACT. A domain duplicated and lost many times.

- 798 We identified a novel domain (ACT) as a candidate OMP domain occurring C-
- terminal in Mt proteins Rv0431, Rv2700, Rv0822c, Rv3267 and Rv3484. In three of
- 800 them it is combined with an N-terminal extracellular domain of unknown function
- 801 (LytR) found in a number of putative membrane-bound proteins. Left: phylogenetic
- tree from an alignment of instances of the domain in the seven mycobacterial species
- 803 analyzed and in Corynebacterineae species: Corynebacterium amycolatum SK46
- 804 (Ca), Rhodococcus opacus B4 (Ro) and Nocardia farcinica (Nf). Right: sequence
- 805 features of the five Mt sequences. Trans-membrane alpha helix (TM, blue) and signal
- 806 peptide (SP, red) were predicted using TMHMM and SignalP-v3.0, respectively. The
- 807 TM in Rv0822c was under the default cut-off of TMHMM and was not predicted but
- the 18 aa region reported displays a maximum of probability of being a TM (with
- scores above 0.6).
- 810

811 Supplementary Table S1– Criteria for OMP prediction.

- 812 This table shows the criteria used to predict OMPs in Method 1 and Method 2 (this
- study). The parameter values for 30 known OMPs are included for comparison.
- 814

815 Supplementary Table S2– OMP score for mycobacterial sequences.

- 816 This file provides the results of the different scores and tests for protein sequences of
- seven mycobacteria used in this manuscript (30,605 sequences of length 50 amino
- 818 acids or more). Each row represents a sequence. The columns indicate (1) species, (2)
- gene identifier, (3) OMP score, (4) Frac, (5) PerBeta, (6) Smean, (7) Dval (from tat),
- 820 (8) number of predicted beta strands of five residues or longer and (9) number of
- residues in those, (10) number of predicted transmembrane helices, (11) position of
- the first transmembrane helix, (12) length of the sequence, (13) computed pI, (14)
- 823 number of cysteines. Columns 15-20 regard the properties found on a 300 amino acid

- 824 window whose position was selected as indicated in Methods: (15) window left start
- 825 position, (16) number of beta strands of length five residues or more, (17) residues on
- those, (18) percentage of beta structure predicted and (19) Frac inside the 300 amino
- 827 acid window, and (20) window beta score.
- 828



OMP scores for S1 and S2 (Group.size>5)





Measures of perbeta and frac over a 300aa Window (Rv2345; CAB06160.1)