

# Prediction of transcription factor binding sites in bacterial genomes: case study with Pectobacterium atrosepticum

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Understanding bacterial gene expression regulation poses a major challenge. We are interested in the phytopathogen Pectobacterium atrosepticum (Pba) which causes disease in potatoes (Fig.1). Using a training set of known transcription factor (TF) binding site sequences, we aim to predict the genome locations of previously unknown binding sites. Modelling the training set pattern is nontrivial, due to the heterogeneity of sequences to which a typical TF binds. Here we model hrp (hypersensitive response and pathogenicity) box sites which bind to the HrpL TF. In order to predict the locations of hrp boxes in the Pba genome, we use a simple modelling method based on regular expressions and a statistical method based on hidden Markov models (HMMs). These hrp box models are then used to search intergenic regions of Pba. Predicted binding sites exhibit a biased distribution towards the horizontally acquired islands (HAIs) of the genome and are shown to lie upstream of genes downregulated in a HrpL mutant.

## Modelling methods

Building of multiple sequence alignment (MSA) using ClustalW (fig.2).

• Generation of models with regular expressions (right) and HMM (using HMMER package [2]). The models are derived from the MSA (fig.2). • Model validation with 10-fold cross-validation method using test sets made up of 2000 random sequences, which were generated using either single nucleotide composition, or di-nucleotide composition of known promoter regions. A diagram of the architecture of the hrp box HMM profile is illustrated in figure 3.

highlight new

candidate genes

of interest, some of which have

been experimen-

tally validated to

regulated genes.

be HrpL-







## Predicted HrpL-regulated genes



Predicted HrpL-regulated genes are depicted in table 1 for HMM based results and table 2 for regular expression predictions. All predictions are found in intergenic regions in the same orientation as their downstream genes. The HMM predictions all have scores above zero. The hits with the highest scores correspond to the wellcharacterized hrp genes (red rows in table 1). These hits are also retrieved with regular expressions. hrp box predictions also

Experimental validation

GENE ID	SYNONYM	PRODUCT	RE1	RE2	RE3	RE4	DISTANCE
ECA2058	-	probable short-chain dehydrogenase	х				272
ECA2062	-	putative phosphatase	х		Х		391
ECA2086	hrpJ	type III secretion protein	Х	Х	Х	Х	65
ECA2093	hrpA	type III secretion protein	х		Х		78
ECA2098	hrpF	type III secretion protein	Х	Х	Х	Х	63
ECA2103	hrpN	harpin	х	Х	Х	Х	83
ECA2104	-	VgrG protein	х	Х			255
ECA2112	hrpW	type III effector protein	Х	Х	Х	Х	61
ECA2113	dspE	putative avirulence protein	Х	Х	Х	Х	38
ECA2150	-	putative membrane protein	Х		Х		167

lable 2: reduced in pure square systems with our legular expansions (i.e. 1-4). A closs includes that a hip box has of identified by the regular expression in the corresponding column, e.g. RE1, RE2, RE3, RE4. The distance refers to the distance between the last nucleotide of the *hrp* box and the first of the downstream gene.

#### Visualisation of predictions on Pba

The hrp boxes predicted are represented on Pba genome (fig.4) using GenomeDiagram [3]. Each circle represents the Pba genome labeled with predictions from distinct methods (labels are in violet for RE2, in green for RE3, in red for HMM). The outer circle indicates the horizontally acquired islands (HAIs) known so far on Pba.

Comparisons between hits found in HAI regions versus non-HAI regions with regular expressions show a bias towards HAI regions (Table 3). This bias is statistically significant (P<0.05) with both Number of hits in HAI region regular expressions tested, but not HMM RE1 RE2

with the HMM



A selection of the predicted hits is shown on figure 5 and 6. Figure 5 shows the QRT-PCR experiments in a HrpL mutant. All specified genes are downregulated except the control (R16S). These genes interest located of are downstream of predicted hrp boxes with either or both of the methods (cf. figure 6).

rectangles are depicted on figure 6.

igure 5: QRT-PCR expression level of some selected genes in a

HrpL mutant. The genes which expression levels are highlighted in



### Conclusion

The predicted hrp boxes include all expected hrp boxes upstream of well-characterized hrp genes, which gives confidence in the existing models to represent members of the hrp box family. Some candidate genes downstream of the putative hrp boxes are found to be downregulated in a HrpL<sup>-</sup> mutant . Future work will investigate the combination of biological features into the models and generalize the predictor for all promoter binding sites on enterobacterial species.

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#### References

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