# Proximity-based cis-regulatory Module Detection using Constraint Programming for Itemset Mining

Tias Guns – Hong Sun – Siegfried Nijssen – Aminael Sanchez-Rodriguez – Luc De Raedt – Kathleen Marchal

### **Problem setting**

#### Single motif discovery tools **many false positives**



**Given:** PWMs of motifs, target genomic sequences and background sequences **Find:** CRMs involving the same transcription factors in multiple sequences

Target

motif

Background



### **Constraint Programming**



General methodology for handling constraint satisfaction problems.

#### **Constraints**, on a set of motifs:

- <u>Proximity</u>: only the motifs' hits that bind in each others proximity are considered,
- <u>Coverage</u>: a sequence is covered if the motifs satisfy the *proximity* constraint on it,
- Frequency: the motifs have to cover a sufficient number of sequences,
- <u>Redundancy</u>: if two related motif-sets have the same *frequency*, remove the smaller one.



## Conclusions



Principled and flexible approach.



Significant reduction of false positives, without reduction of true positives.







#### Competitive or better predictive performance.

### Future work:

- Add more constraints (overlap, priors, ...) - Other data sources (ChipSeq, ...)

