

# Automated Inference of Gene Regulatory Networks Using Explicit Regulatory Modules (*shortened version*)

Clémence Réda\* & Bartek Wilczyński†

\*École Normale Supérieure Paris-Saclay, Cachan, France

†Faculty of Mathematics, Informatics and Mechanics,  
University of Warsaw, Warsaw, Poland

September 8<sup>th</sup>, 2018

## 1 Introduction

- Objectives
- Boolean Networks

## 2 Building Cis-Regulatory Networks

- Cis-Regulatory Networks
- Building a CRN From a Boolean Network
- Analysis & Biological Insights

## 3 Conclusion

- Summary

# Objectives

Design a modelling framework (or a general method) that:

- Takes into account cis-regulatory action on genes.
- Is flexible and can be applied to current networks.
- Ensures some biologically-relevant constraints in networks.

# (Reminder) GRNs Seen as Boolean Networks

## Boolean Network

- A set  $V$  of **vertices**/biological entities

in state ON (1) or OFF (0)

- A set  $E$  of **edges**/vertex-pairwise interactions labelled by  $+$ ,  $-$

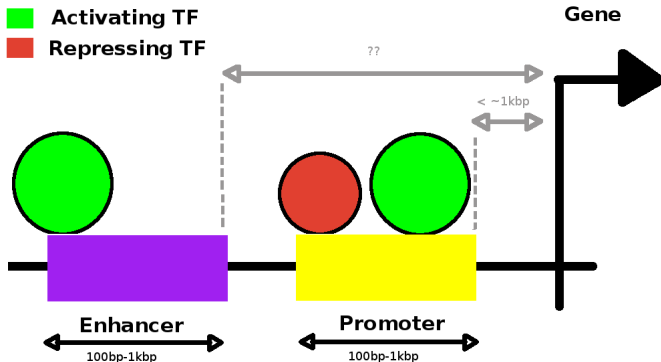
$$E \subseteq V \times V \times \{+, -\}.$$

- A set  $F$  of gene **regulatory functions**  $(f_g)_{g \in V}$  for each gene that update gene states

# Transcriptional Cis-Regulatory Action

## Cis-Regulatory Module (CRM)

Stretch of DNA where TFs bind & regulate expression of nearby genes [Davidson, 2006].



# Example of Cis-Regulatory Network

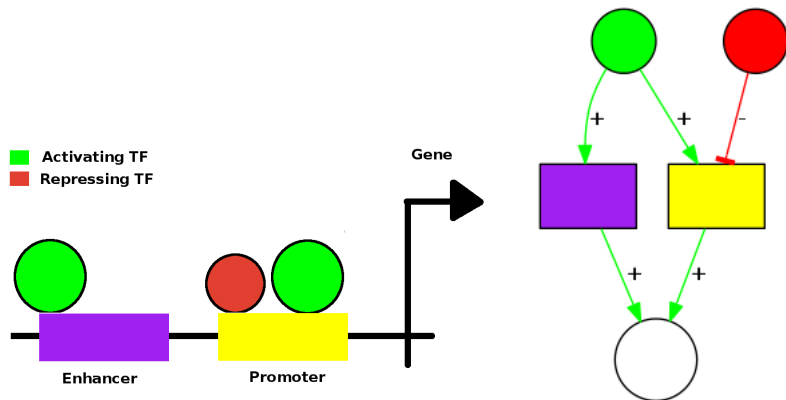
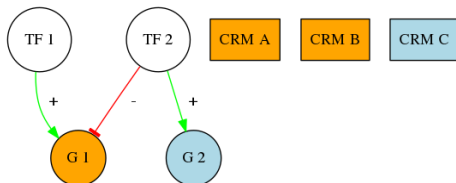


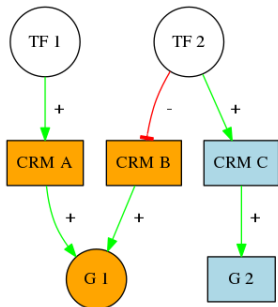
Figure: TF bindings (*left*). Associated CRN.

# Illustration of Expansion Procedure

TF1 binds to CRM A, TF2 binds to CRM B and C.



→ expansion



# Properties of Regulatory Functions in CRNs

## Good news for Cis-Regulatory Networks:

### Lemmas

- 1 All regulatory functions for CRMs and TFs are monotonous  
⇒ All regulatory functions for genes are **monotonous**
- 2 In such a modelling framework,  
All regulatory functions for genes are **decomposable**  
(by construction)



# Recap

## Our contributions:

→ Formal definition of CRNs:

- 1 Extension of **Boolean networks**.
- 2 Explicit implementation of **cis-regulatory modules**.
- 3 **Modularity** and structure of regulatory functions.
- 4 Modelling of **redundancy** of regulatory interactions.

→ Proofs of preservation of biologically-relevant properties (namely, **monotonicity**, **decomposability**).

→ **Code** for the expansion & network inference procedures (using a method similar to RE:IN [Yordanov et al., 2016]).