# Number of transcription factors and binding sites

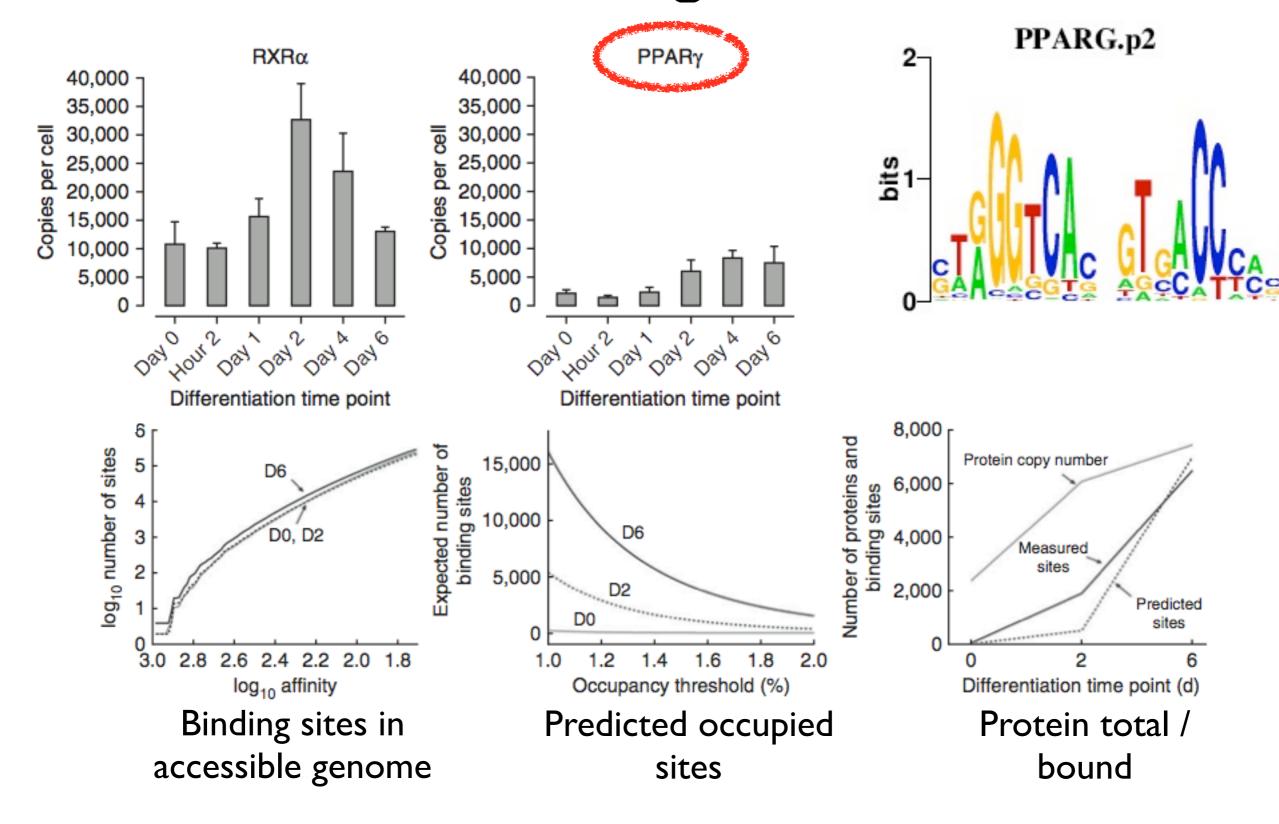
- Mass spectrometry (proteomics) technique to count absolute nb of TF per cell
- ChIP-seq to measure genome-wide (relative) occupancy of same TF
- ChIP-seq of histone modification to characterize accessible vs inaccessible chromatin

## Absolute quantification of transcription factors during cellular differentiation using multiplexed targeted proteomics

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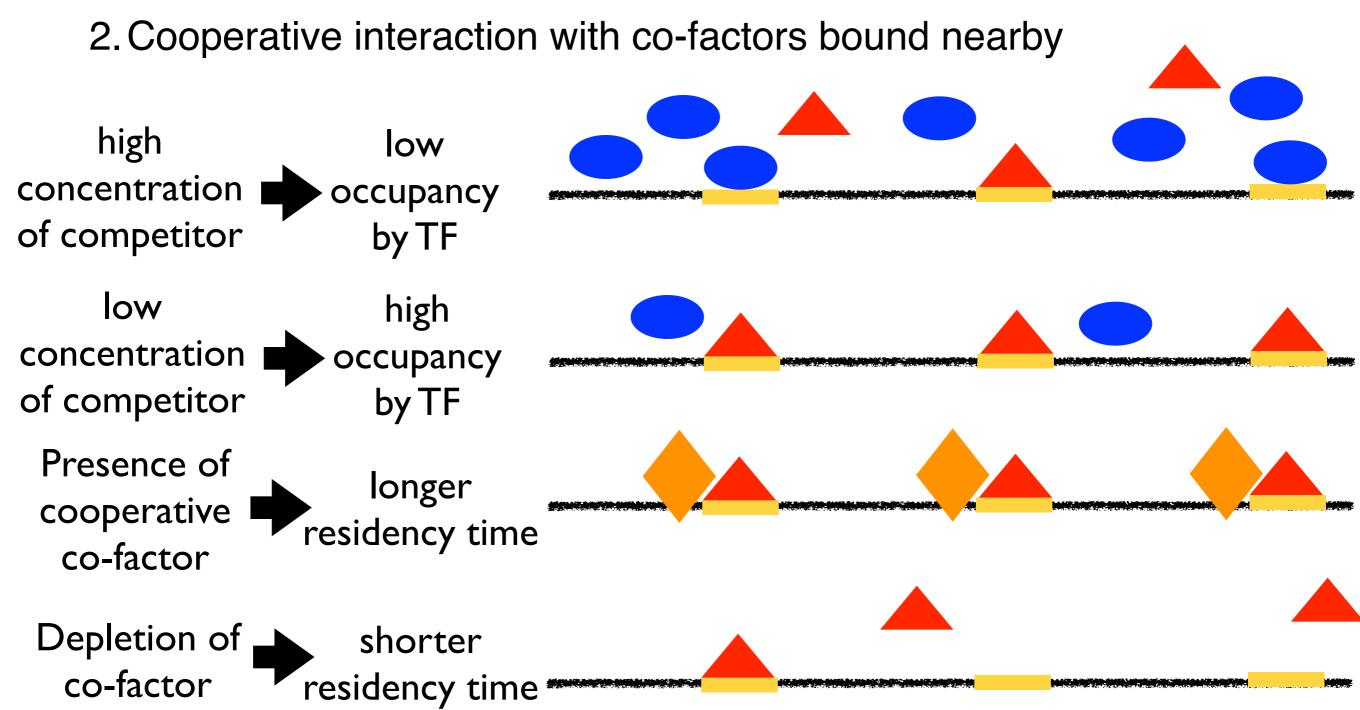
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## What are the limitations of this model?

Model is wrong if occupancy is not just a function of site affinity and protein concentration, for example in case of:

1. Competition with a different factor for similar sites



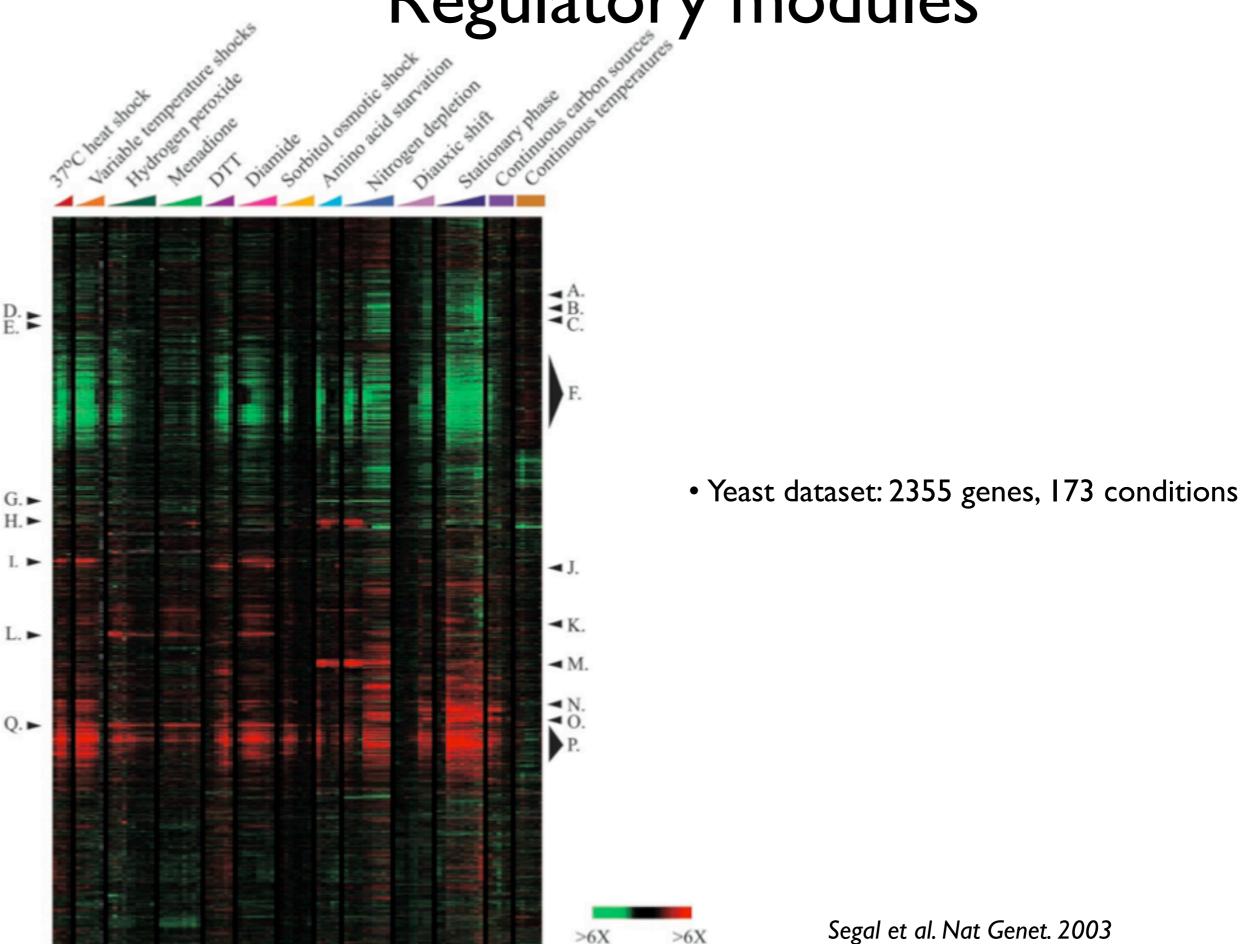
### What are the limitations of this model?

We treat every cell like the population average

- Average transcription factor concentration is low, this does not imply that it is low in every cell
- The average site occupancy is a non-linear function of protein concentration: the average occupancy at fluctuating concentrations is not equal to the occupancy at the average concentration

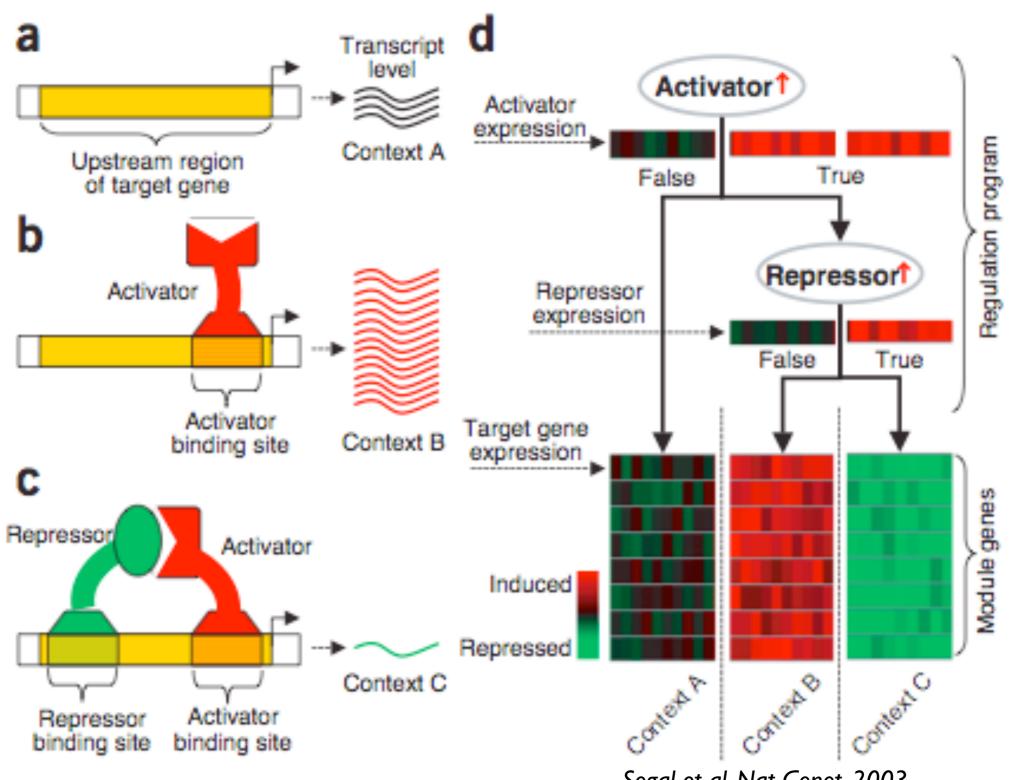
The factor can exist in an active and an inactive chemical form, the measured concentration is not always able to distinguish the two forms





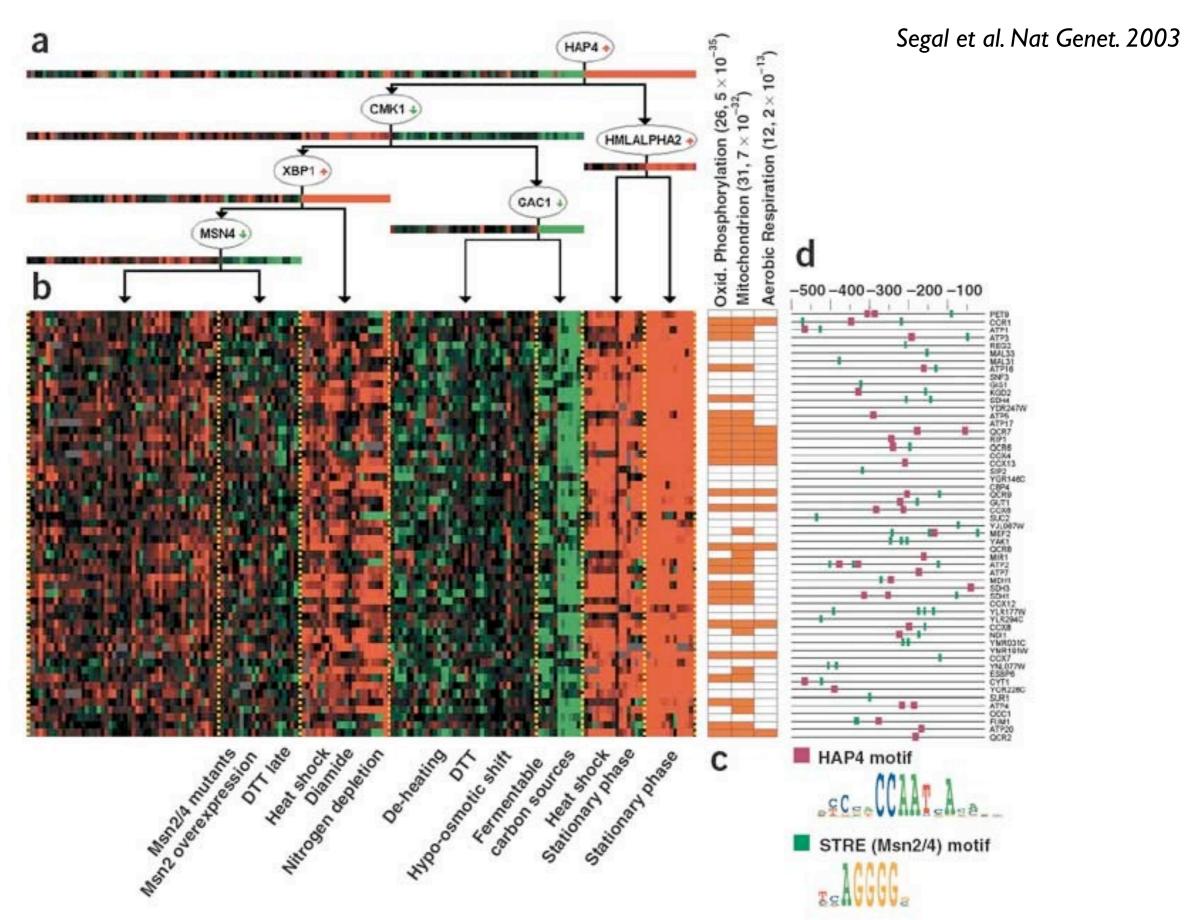
induced

## Regulatory modules



Segal et al. Nat Genet. 2003

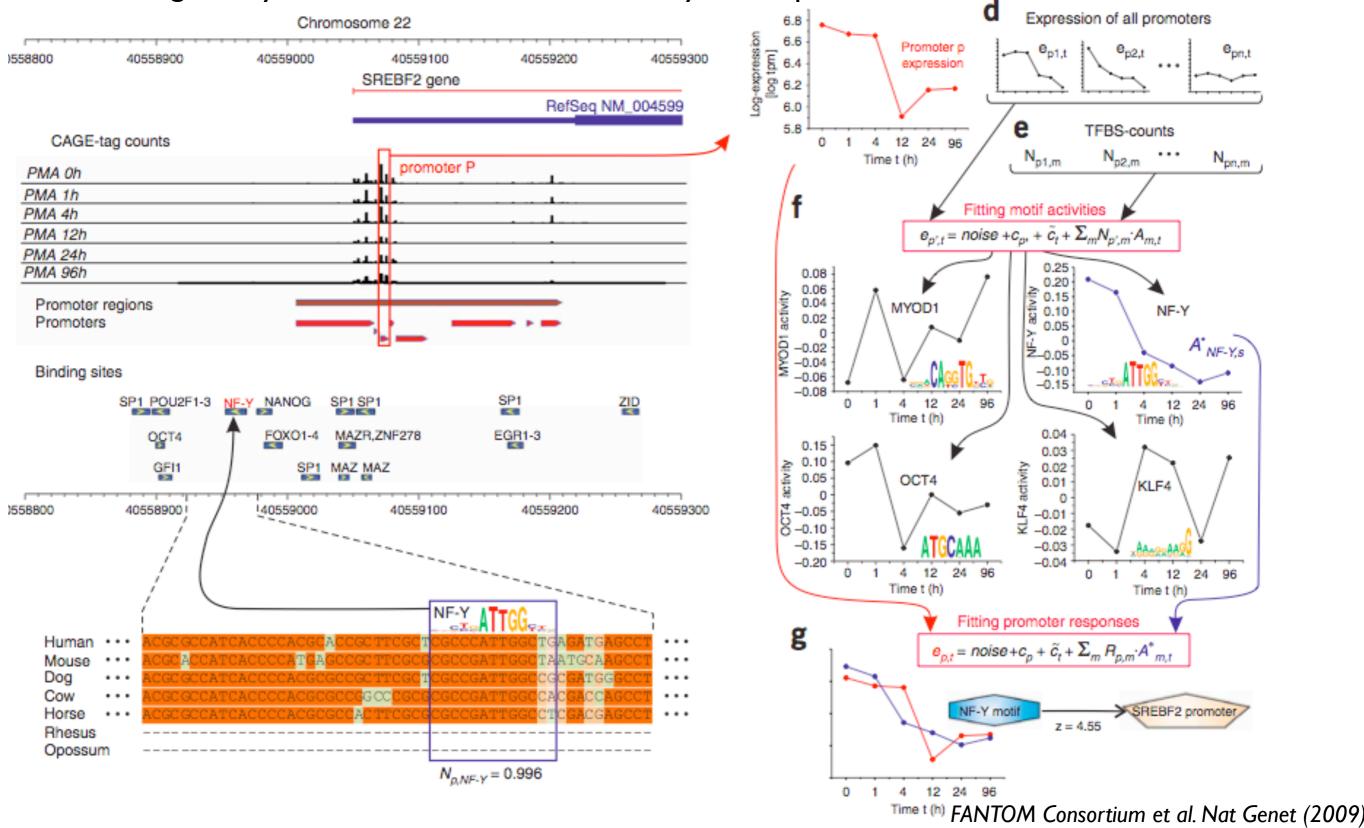
## Regulatory modules



#### **MARA**

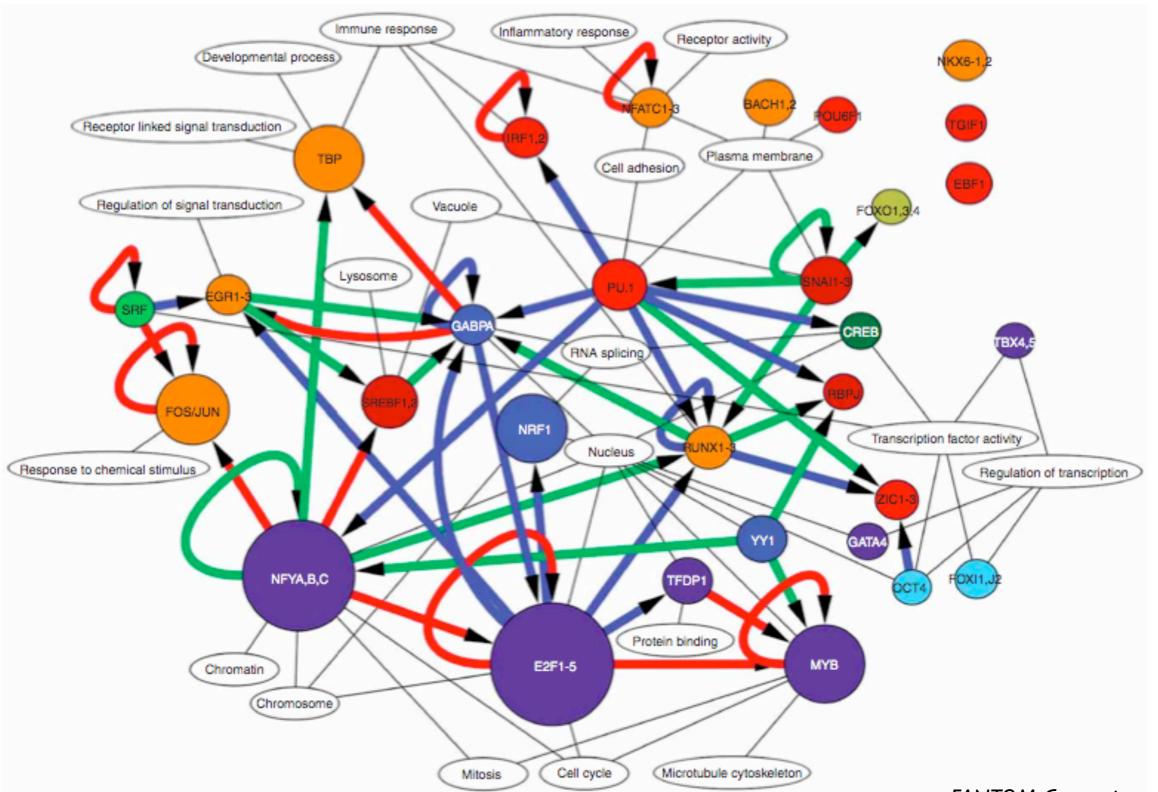
• Motif Activity Response Analysis (E. van Nimwegen, U of Basel)

• Infer regulatory network from motifs, TF activity and expression



## **MARA**

- Motif Activity Response Analysis (E. van Nimwegen, U of Basel)
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### Fisher combined test

- We collect multiple data of different types from separate experiments (ex.: ChIP-seq, RNA-seq, motif occurrence, etc.)
- We have a statistical procedure for each experiment, providing a p-value for each gene
- Can we gain power from mixing these data?

Fisher combined statistics: 
$$X^2 = -2\sum_{i=1}^{\kappa} \log_e(p_i)$$
,

• This has a chi-square distribution with 2k degrees of freedom



single global p-value