

# Network and modularity analysis

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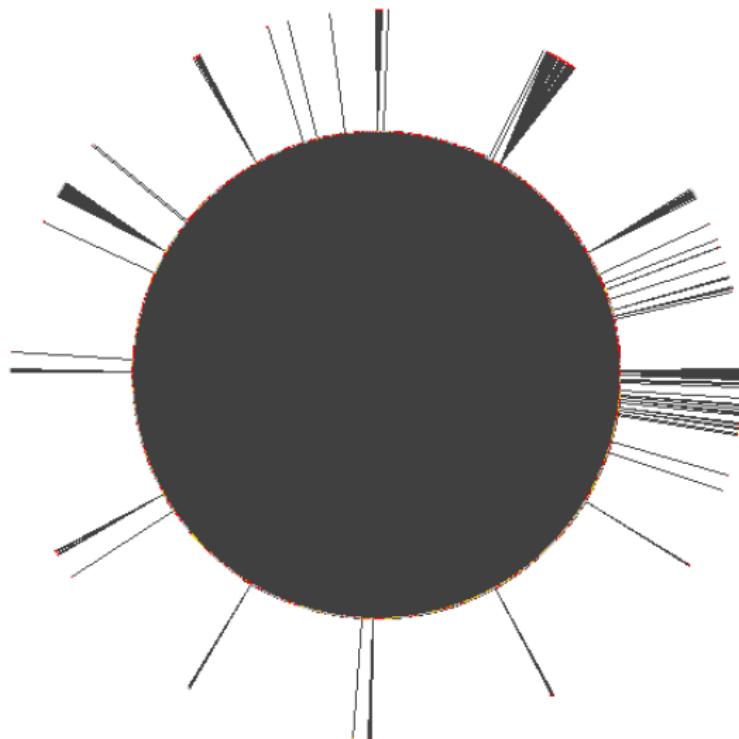
December 21, 2016

**Yale**

## Network

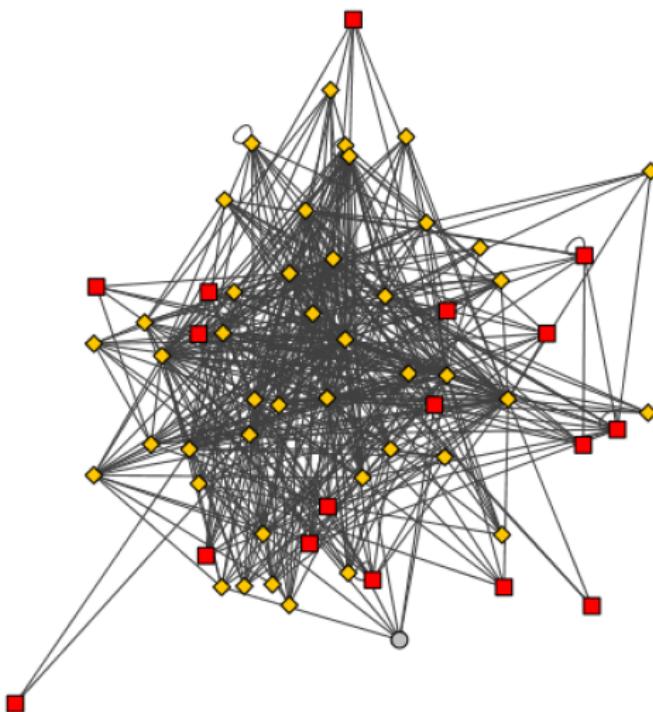
- ▶ enhancer distal regulatory network: enhancer gene linkage with ChIP-Seq peaks
- ▶ TF regulatory network: ChIP-Seq
- ▶ TIP: ChIP-Seq
- ▶ PPI and gene expression

## Dense network



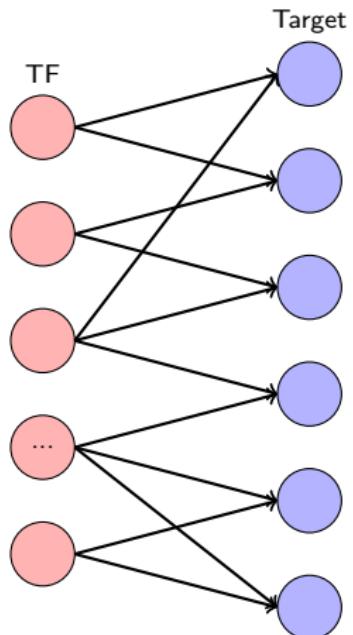
It is difficult to identify modules from such a dense network (above is circular layout for TF regulatory network).

## TF-TF only network

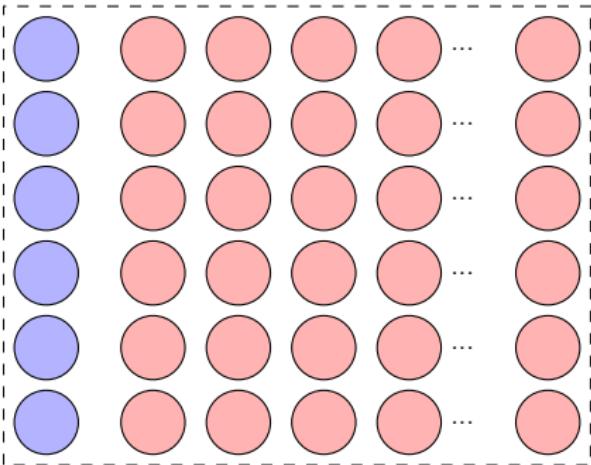


Even only consider TF-TF regulations, the structure is complex and hard to compare between cell lines (TF-TF interactions in TF regulatory network)

Target based matrix

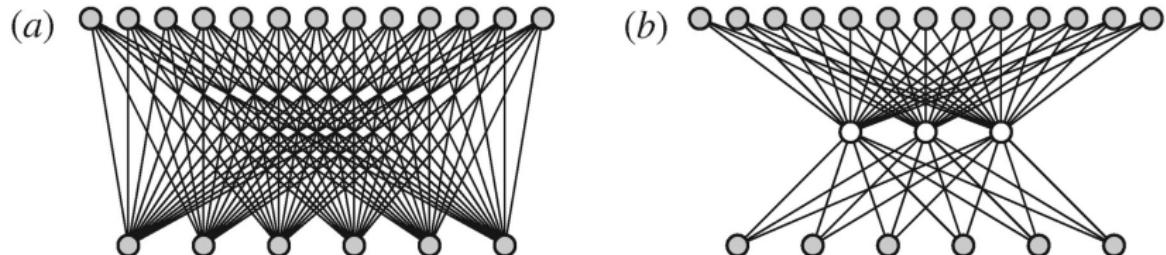


TF based matrix



Regulator network can be transformed into two different views. Today I will only focus on using target to infer the hidden classes for TFs and also estimate the rewiring/changes between Gm12878 and K562 cell lines.

## Mix Membership Model



target gene layer (top):  $J = 1, \dots, j$

Hidden membership (class) layer:  $H = 1, \dots, k$ ,  $k=4$

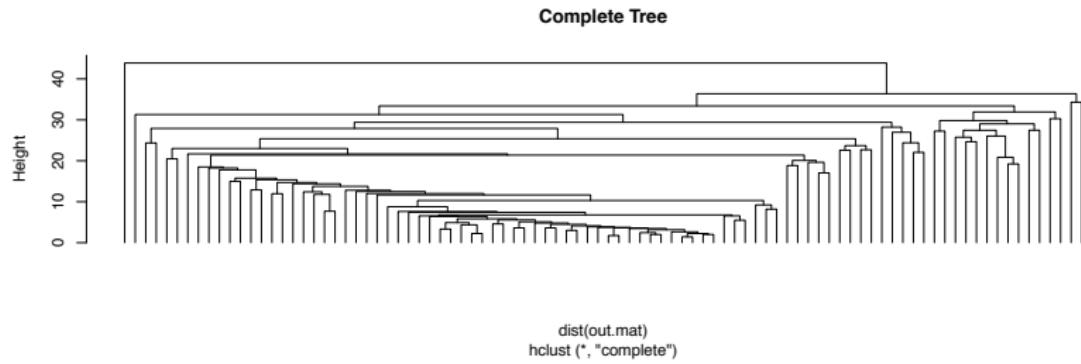
TF layer (bottom):  $T = 1, \dots, n$

Membership layer link the target gene and TF. each TF has a proportion  $\lambda$  for hidden membership, which is drawn from Dirichlet distribution;

For each hidden membership,  $H$  is drawn from multinomial distribution for all the target genes with parameter  $\theta$ .

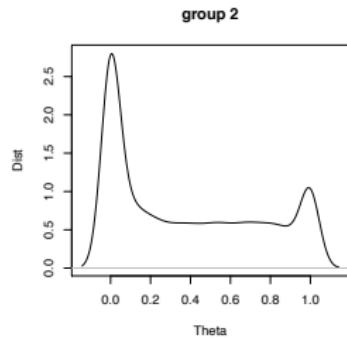
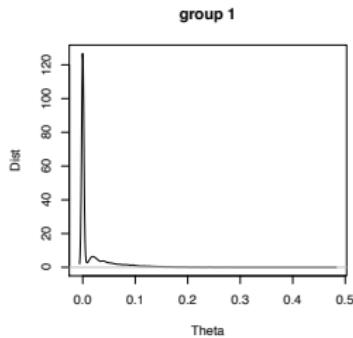
Each target gene is categorical variable 0,1 for each TF, where 1 means is target, 0 means not.

# Clustering



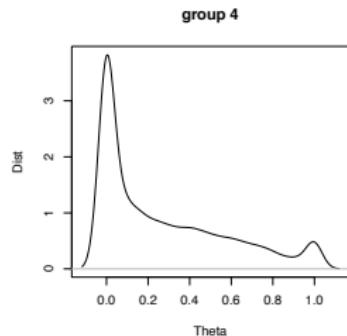
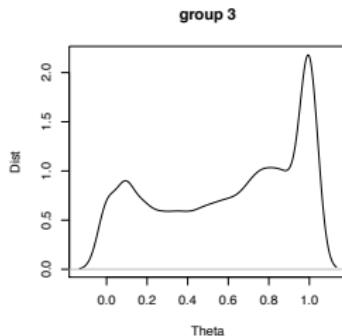
Simple clustering cannot explore the complex structure and compare two different samples.

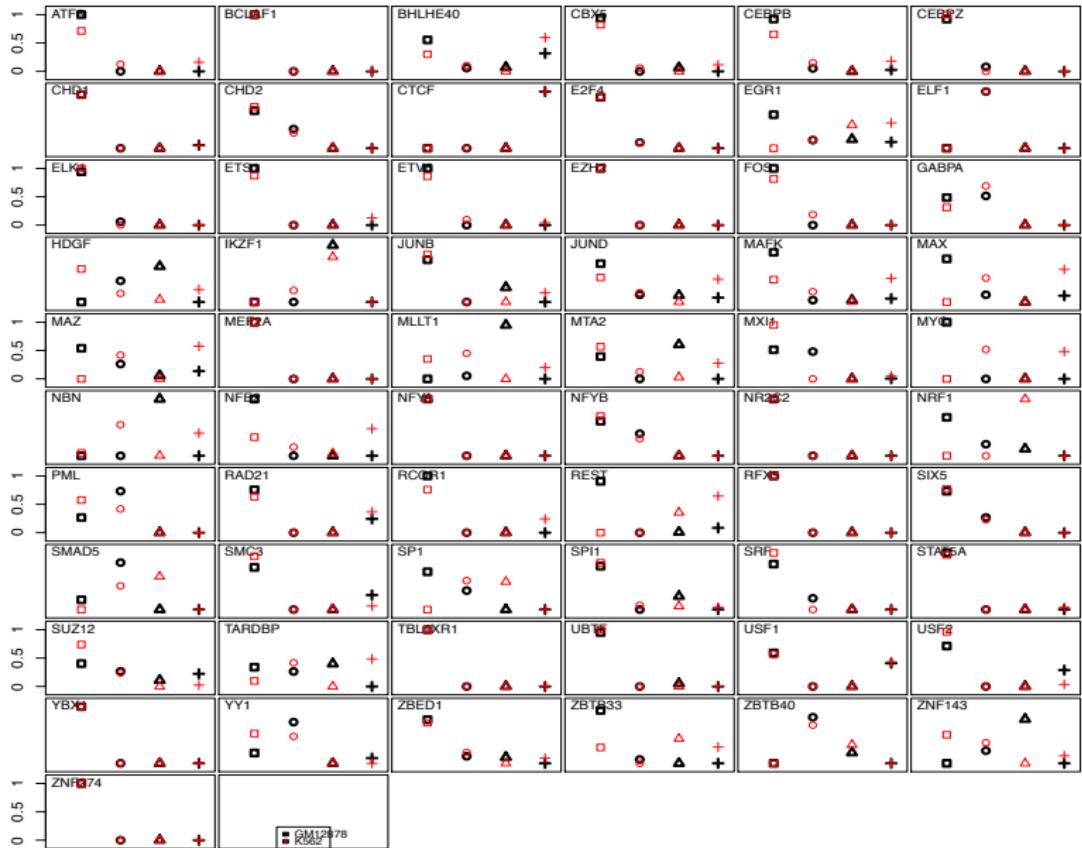
Theta distribution for gene be a target of TF in four hidden group/memberships, and membership change if assign the group for each TF using max probabllity in all the four classes.(group=class=membeship)



	K.g1	K.g2	K.g3	K.g4
G.g1	36	2	2	7
G.g2	2	3	1	0
G.g3	3	2	1	1
G.g4	0	0	0	1

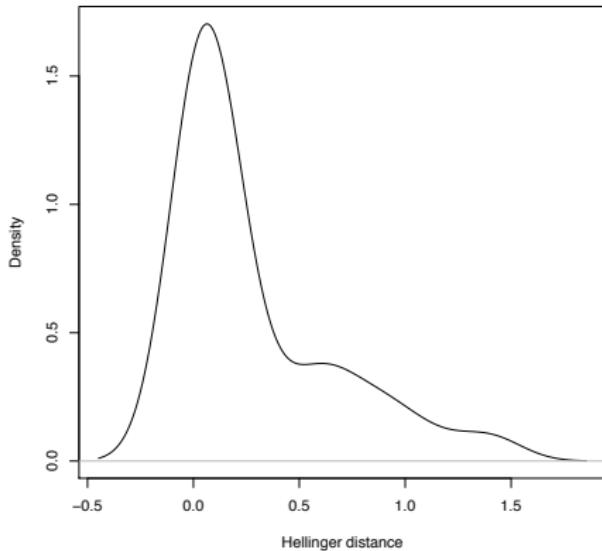
Table: TF groups/membership changes





visualization of membership changes between Gm12878 and K562

Hellinger Distance  $d = \frac{1}{\sqrt{2}} \sqrt{\sum_i (\sqrt{p_{Gm,i}} - \sqrt{p_{K,i}})^2}$ , is used to quantify the membership change between Gm and K cell lines



Top changed TF:  
NBN, MYC, MLLT1,  
ZNF143, REST, NRF1, HDGF,  
SP1, MAX, ZBTB33, TARDDBP,  
NFE2, SMAD5, MTA2, EGR1,  
MAZ