

May, 2015

Review TADA

Extended  
TADA  
Model

Autism data

Schizophrenia  
data

Data  
Methods  
Results:includeEXAC

Risk genes  
Intersect with  
gene sets

Results:NotEXAC  
Risk genes  
Intersect with  
gene sets

May, 2015

May 2, 2016

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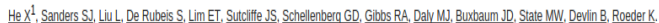
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- Review exTADA (Transmission And De novo Association) model.
- Test exTADA on autism data.
- Apply exTADA to schizophrenia data.
  - Estimate the proportion of risk genes.
  - Test results on gene sets.

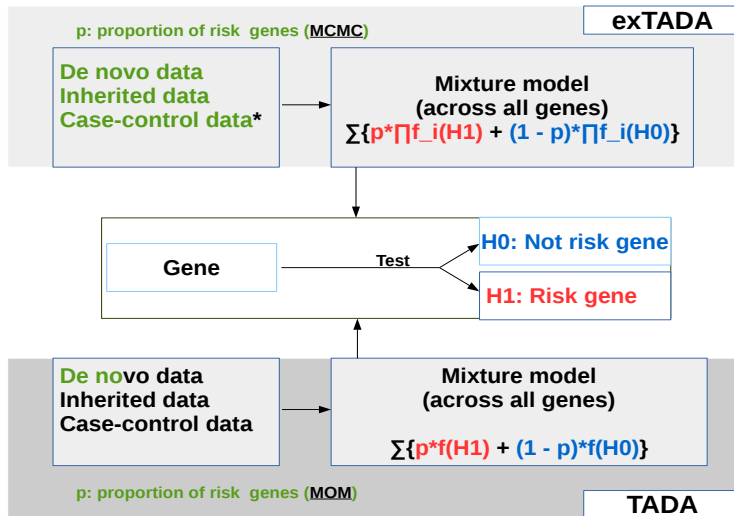


## Original TADA

- Use only LoF de novo mutations  $\Rightarrow$  the proportion of risk genes ( $\pi$ ) \*\*
- Use known risk genes AND \*\* to infer other information of other categories.

## Extended TADA

- **Estimate simultaneously all parameters of all annotations (e.g., LoF, missense damaging) including  $\pi$**
- Do not use known risk genes (it can be used, but not necessary).



## Main work

- De novo mutations: the same as original TADA.
- **Inherited/Case-control: use an approximate model in the estimation process<sup>1</sup>.**
- **Estimate all parameters using a MCMC method (known risk genes are not necessary).**

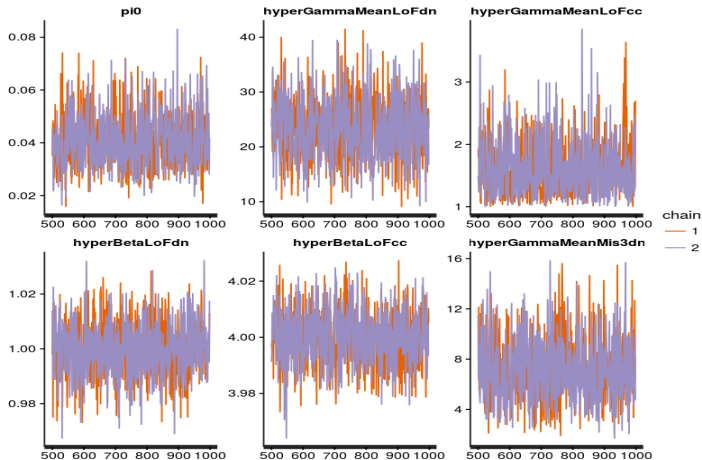
Model: **Internal product**

$$P(x|parameters) = \prod_{i=1}^m \left[ \pi P(x_{i_{LoF}} | H_1) P(x_{i_{mis3}} | H_1) + (1 - \pi) P(x_{i_{LoF}} | H_0) P(x_{i_{mis3}} | H_0) \right]$$

<sup>1</sup>Idea of changing case-control model is from Xin He

## Autism Data

Use **non-information priors** => similar results as TADA (based on known risk genes)



## Schizophrenia data

Sample sizes from different studies.

| Source                 | De novo | Non/Transmitted | Case | Control |
|------------------------|---------|-----------------|------|---------|
| Fromer et al. (2014)   | 617     | 617             |      |         |
| Girard et al. (2011)   | 14      |                 |      |         |
| Gulsuner et al. (2013) | 105     |                 |      |         |
| McCarthy et al. (2014) | 57      |                 |      |         |
| Xu et al. (2012)       | 231     |                 |      |         |
| Giulio et al. (2016)   |         |                 | 4954 | 6239    |
| Total                  | 1024    | 617             | 4954 | 6239    |



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Focused on:

- De novo (DN) + Transmitted (Trans) + Case-Control (CC).

Also tested:

- De novo (DN) + Transmitted (Trans).
- De novo (DN) + Case-Control (CC).
- De novo (DN).

Categories: LoF and missense damaging (7 methods from Giulio).

Private (Not in Exac) or Non-private (include Exac).

# How many risk genes

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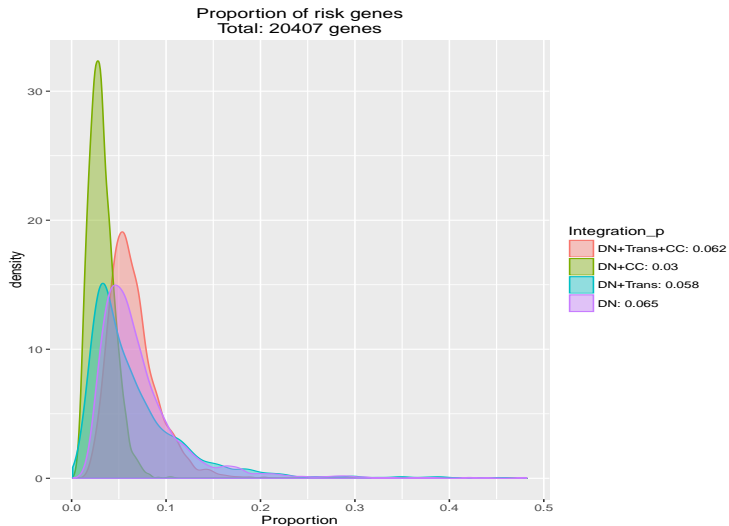
Intersect with  
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Previous studies (The unseen species problem):

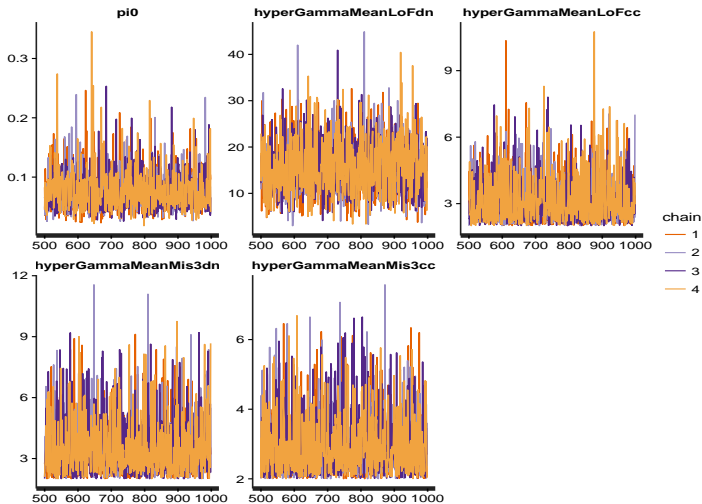
- Xu et al (2012): **868 genes** based on 231 parent-proband trios and 34 unaffected trios.
- Fromer et al (2014): **4000 to 12000 genes** based on 623 schizophrenia trios (use LoF and NS mutations).

# How many risk genes from exTADA?

Singleton data + NOT private.



## DN + Trans + Case/Control



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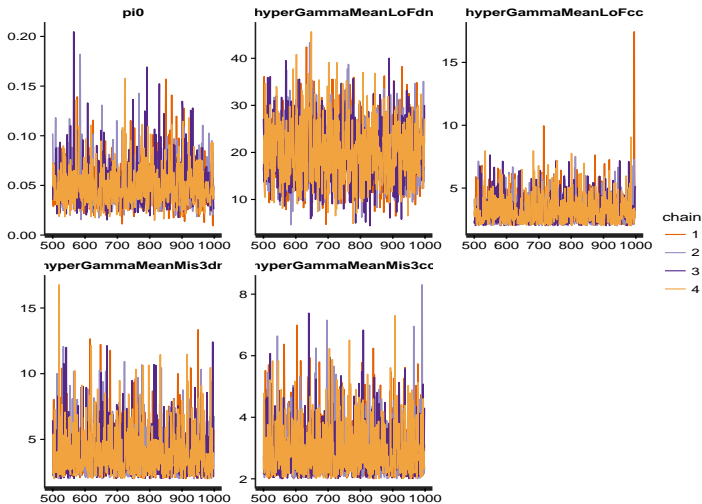
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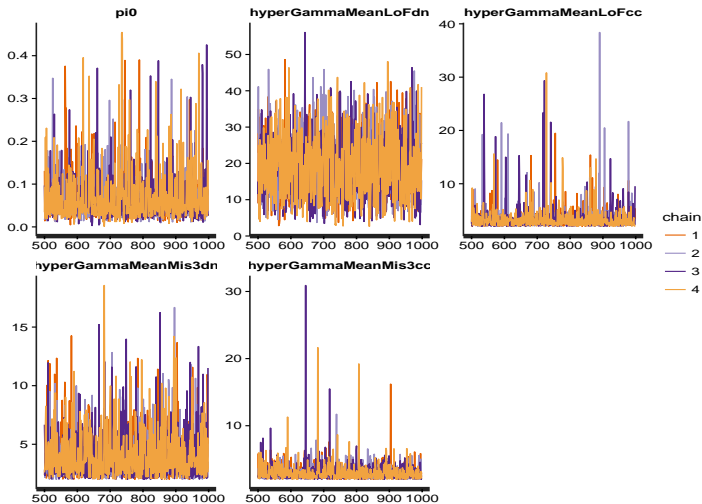
Intersect with

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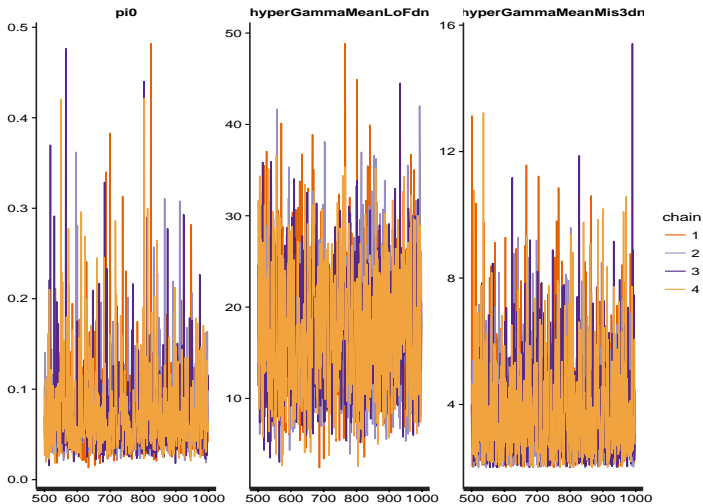
## DN + Case/Control



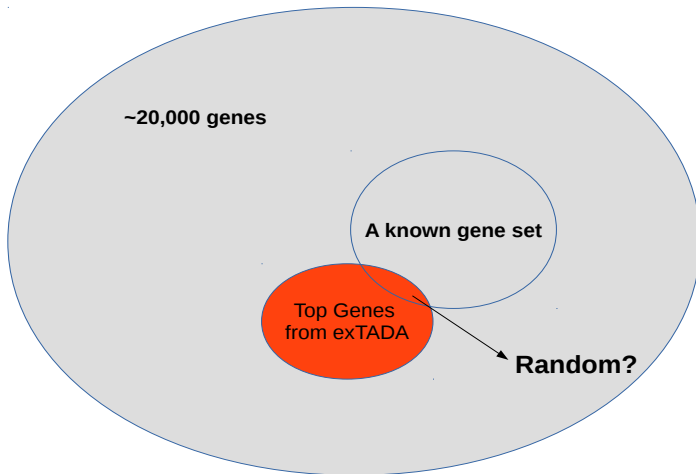
## DN + Trans



DN



## Intersect with known gene sets





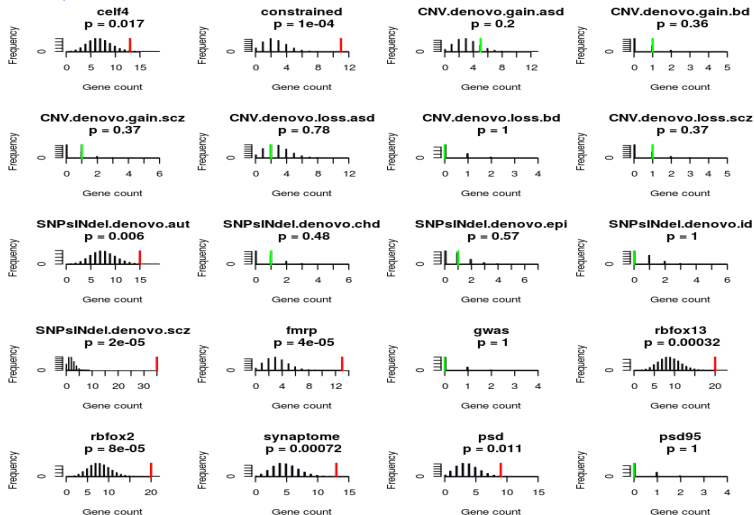
## Intersect with known gene sets

**Calculate p value for each gene set (N genes)**

- Count the number of genes overlapping between the *IGene* genes and the gene set,  $nG$ .
- For  $i$  from 1 to  $K$  (times)
  - Randomly choose a set of  $N$  genes from all genes ( $>20000$  genes).
  - Count the number of genes overlapping between the *IGene* genes and the random gene set,  $M_i$ .
  - $pValue = (length(vM[vM \geq nG]) + 1) / (K + 1)$   
with  $vM = c(M_1, M_2, ..M_K)$

FDR &lt; 0.3

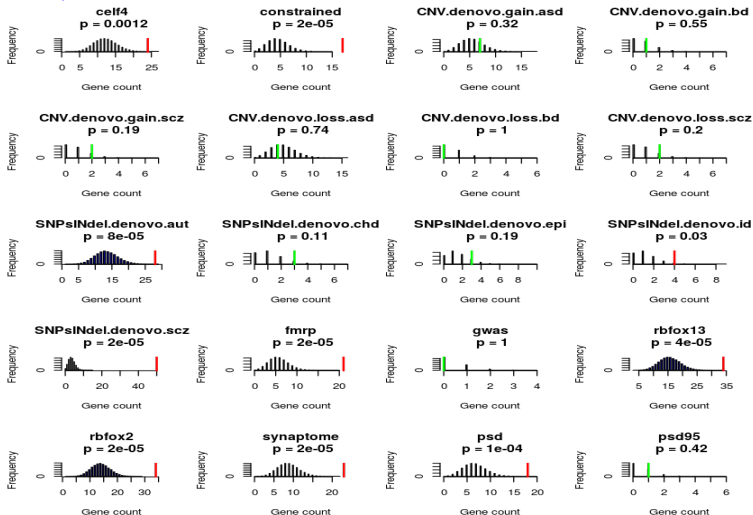
## DN + Trans + CC





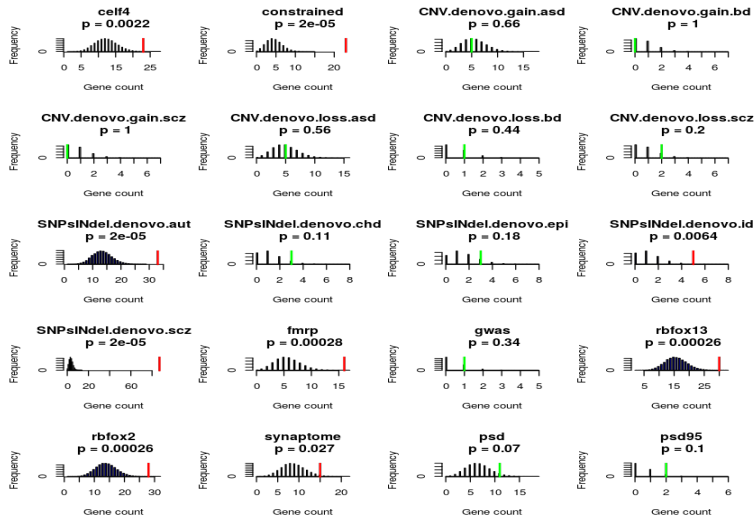
## Top 100 genes

## DN + Trans + CC



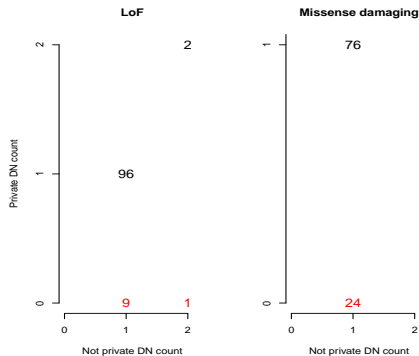
## Top 100 Genes

## DN + Trans



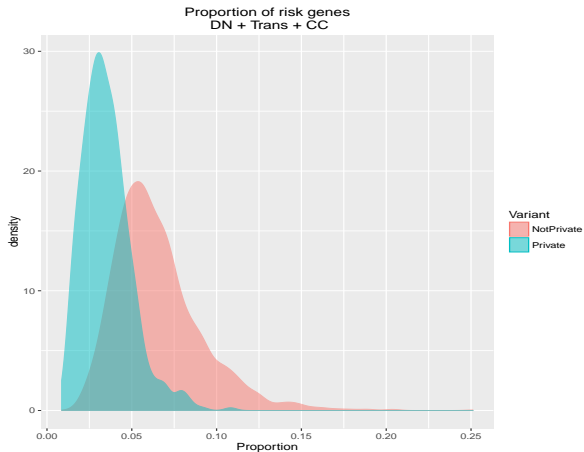
## Not EXAC

- Remove all variants in EXAC (= Private variants) => lose 1 LoF double-hit gene.
- Use the same mutation rates.<sup>2</sup>



<sup>2</sup>Re-calculating mutation rates by removing all Exac variants

## Proportion of risk genes not high



# Not EXAC

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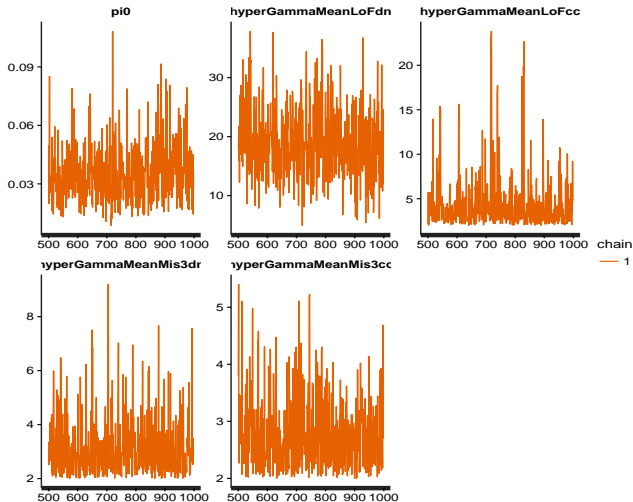
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FDR &lt; 0.3, NonExac

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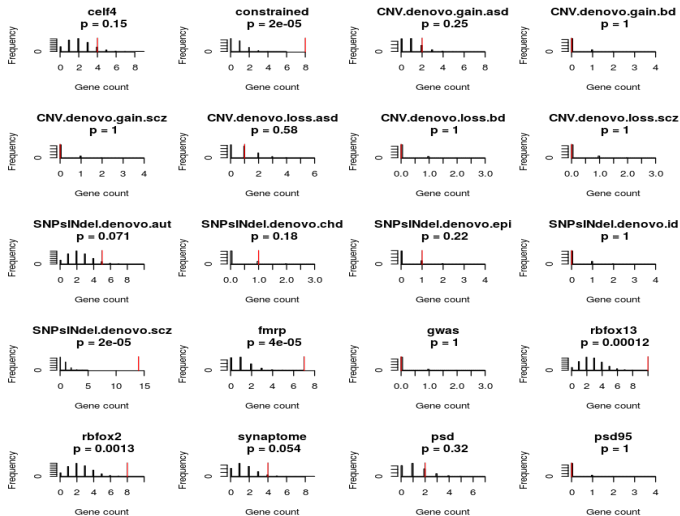
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## Top 100, NonExac

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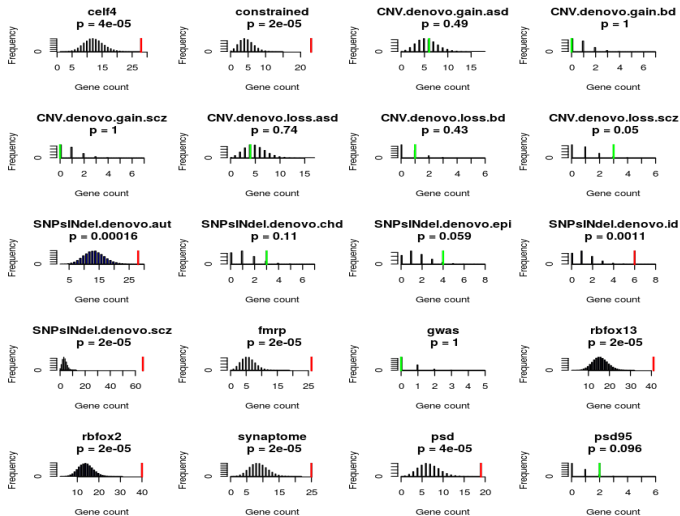
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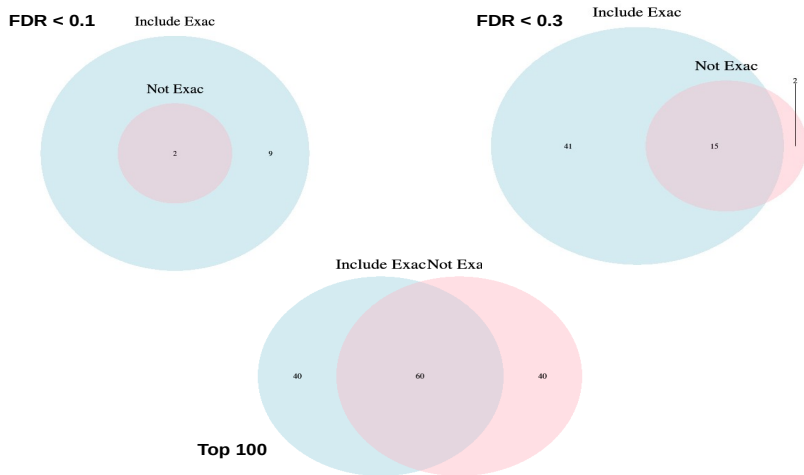
Results:NotEXAC

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## Private and Not private

Overlapping genes with different thresholds:



## Overlapping genes

Overlapping genes:  $\text{FDR} < 0.1$

Both LoF de novos of **TAF13** are in Exac variants.

| Gene          | NotPrivate | Private |
|---------------|------------|---------|
| ADCY6         | 1          | 0       |
| BLNK          | 1          | 0       |
| EPHA5         | 1          | 0       |
| HEATR2        | 1          | 0       |
| MARK4         | 1          | 0       |
| MPO           | 1          | 0       |
| PRRC2A        | 1          | 0       |
| ROBO1         | 1          | 0       |
| <b>TAF13</b>  | 1          | 0       |
| <b>RB1CC1</b> | 1          | 1       |
| <b>SETD1A</b> | 1          | 1       |

Working on:

- Simulation data.
- Private variants with new mutation rates.

Should test other gene sets?

THANK YOU!!!!!!