

# Integrative Biology Approach to Complexity of Alzheimer's Disease and Novel Target Discovery and Validation

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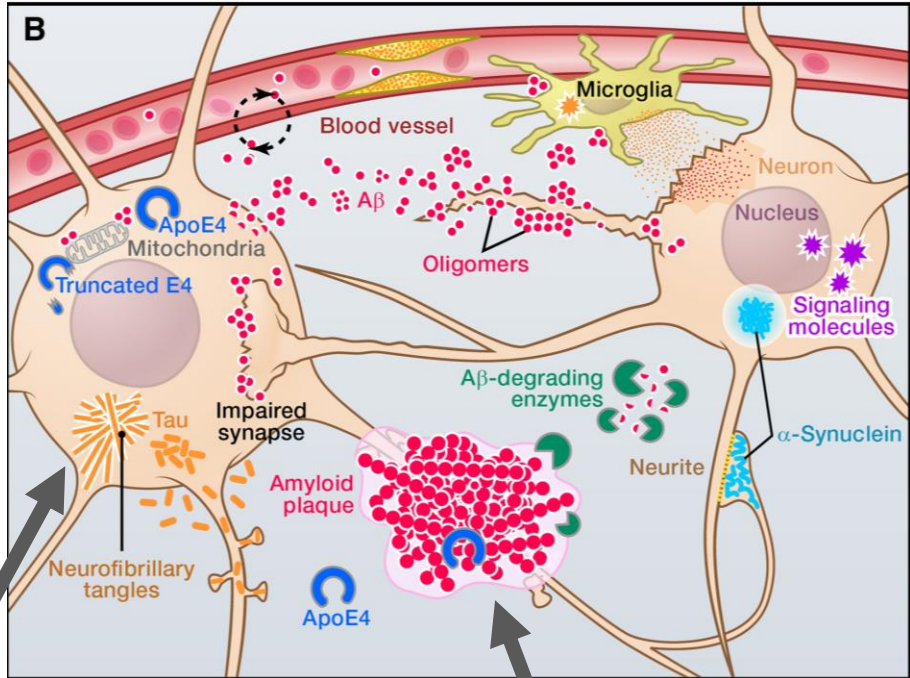
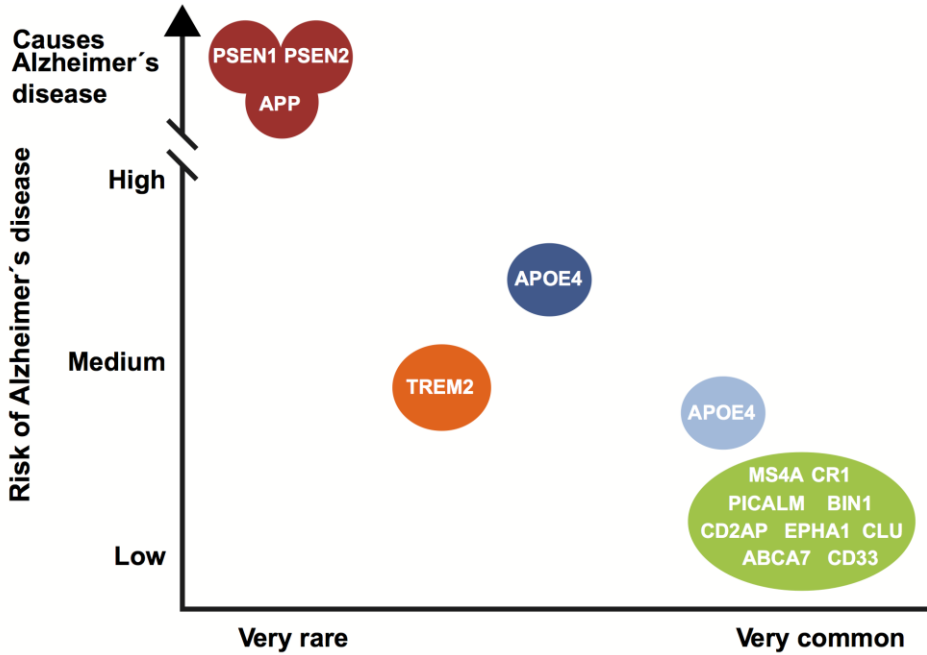
Eric Schadt's Lab

Icahn School of Medicine at Mount Sinai

# Alzheimer's Disease (AD)

Growth in dementia cases by 2050

SOUTHEAST



Frequency in the population

Hardy et al., Journal of internal medicine, 2014



Huang Y. et al, Cell. 2012 Mar 16;148(6):1204-22

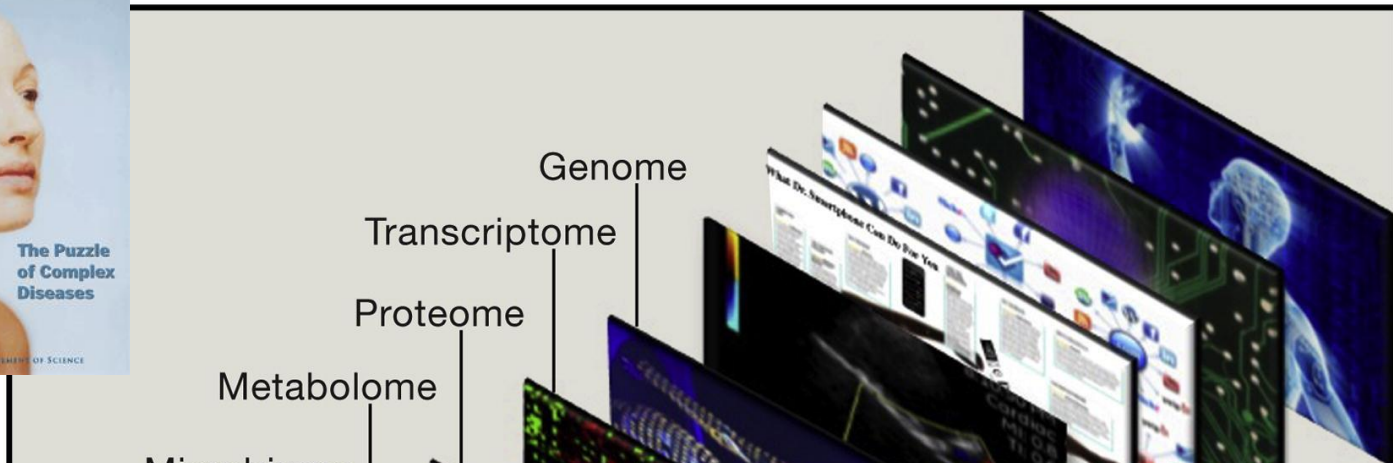
Source: Alzheimer's Disease International

# AD is complex

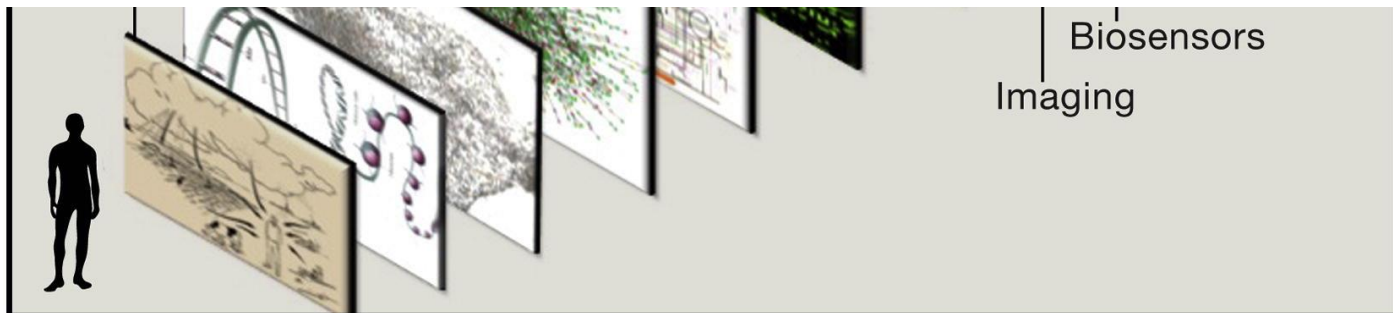
- No perfect characterization
- No precise diagnosis
- Mechanisms and causes largely unknown
- No cure



# Multi-omics are increasingly widespread



## How can we learn more by integrating omics?



# Systems based functional approach

## Resource

Cell

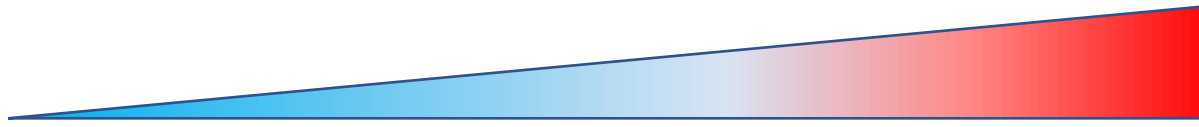
## Constructing multiscale models to further AD understanding

Bi  
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Manikandan Narayanan,<sup>6</sup> Christine Suver,<sup>4</sup> Hardik Shah,<sup>1,2</sup> Milind Mahajan,<sup>1,2,3</sup> Tammy Gillis,<sup>9</sup> Jayalakshmi Mysore,<sup>9</sup>  
Marcy E. MacDonald,<sup>9</sup> John R. Lamb,<sup>10</sup> David A. Bennett,<sup>11</sup> Cliona Molony,<sup>6</sup> David J. Stone,<sup>7</sup> Vilmundur Gudnason,<sup>12</sup>  
Amanda J. Myers,<sup>13</sup> Eric E. Schadt,<sup>1,2,3</sup> Harald Neumann,<sup>5</sup> Jun Zhu,<sup>1,2,3</sup> and Valur Emilsson<sup>12,\*</sup>

# AMP-AD dataset



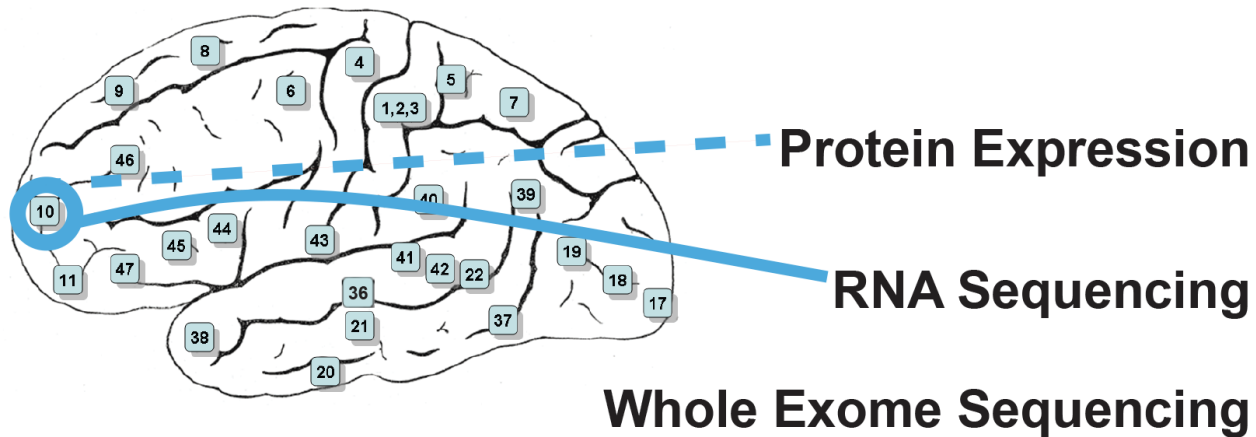
No  
disease



Definite  
AD

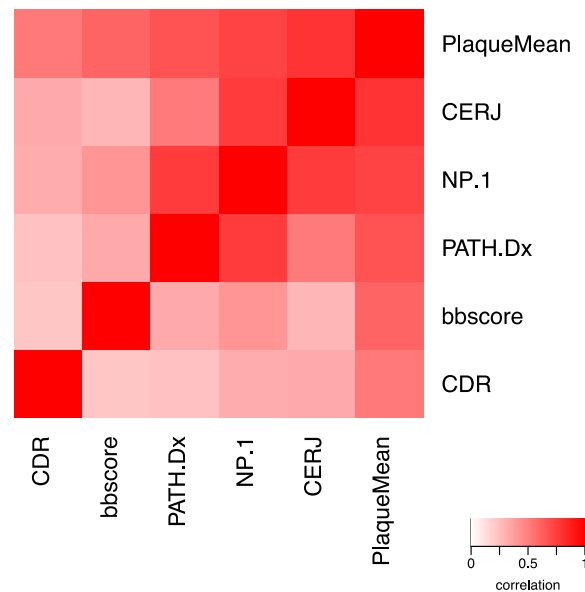
N=315

BM10: Anterior Prefrontal Cortex

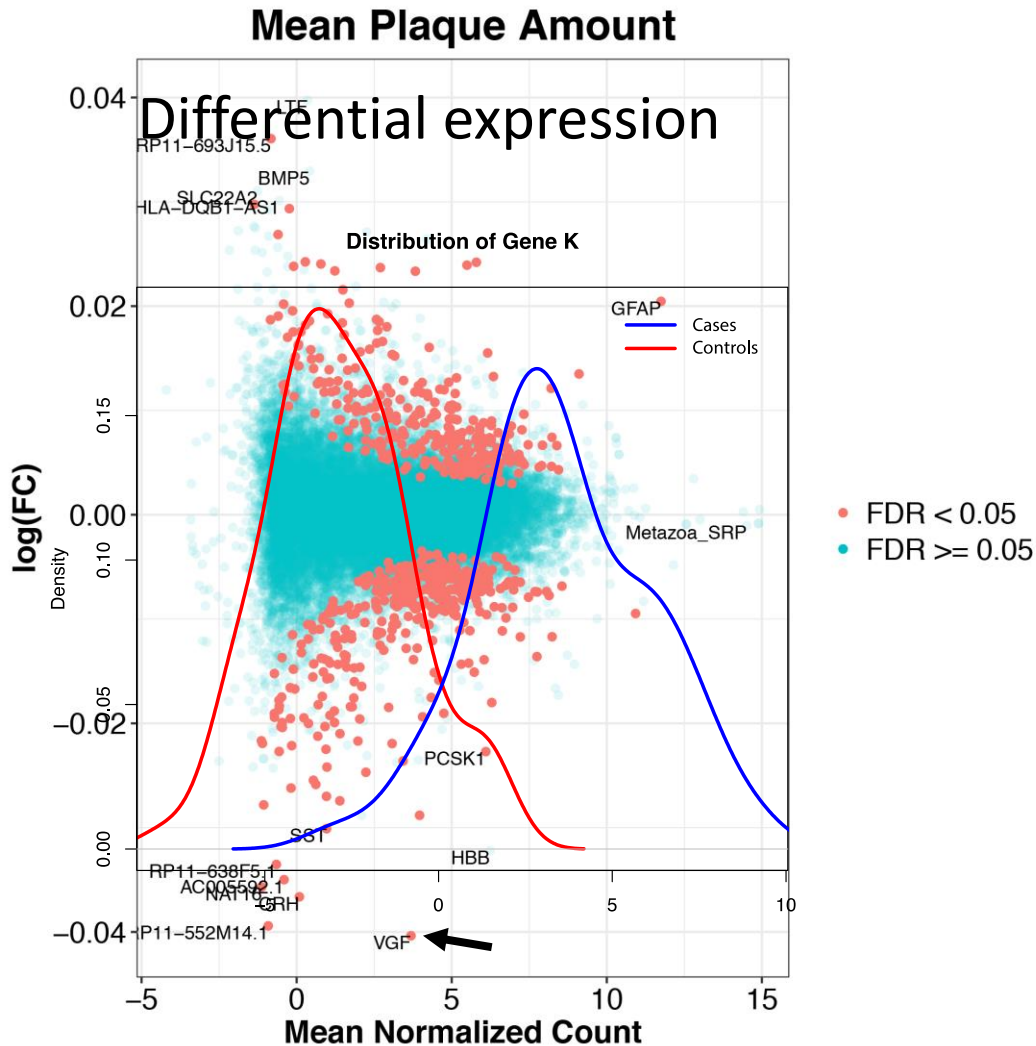


# Clinical and neuropathological traits represent different aspects of AD

CDR	clinical dementia rating
bbscore	braak score
PATH Dx	clinical neuropathology
NP-1	neuropathology category
CERJ	CERAD neuropath Criteria
PlaqueMean	mean neocortical plaque density (number of plaques/mm <sup>2</sup> )



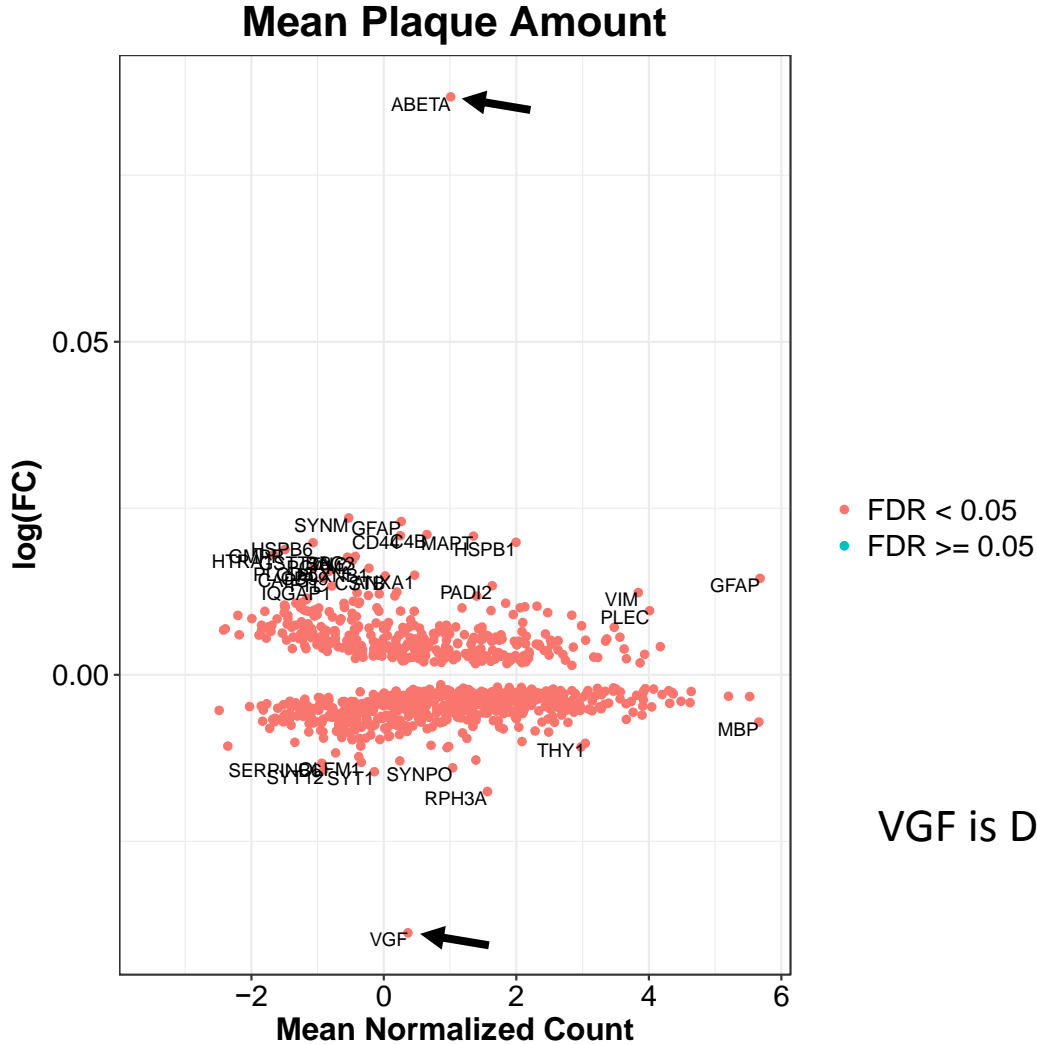
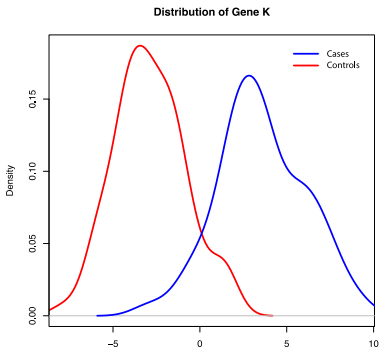
# VGF transcript has the largest log Fold Change (FC) for AD





# VGF protein has the largest logFC after ABeta

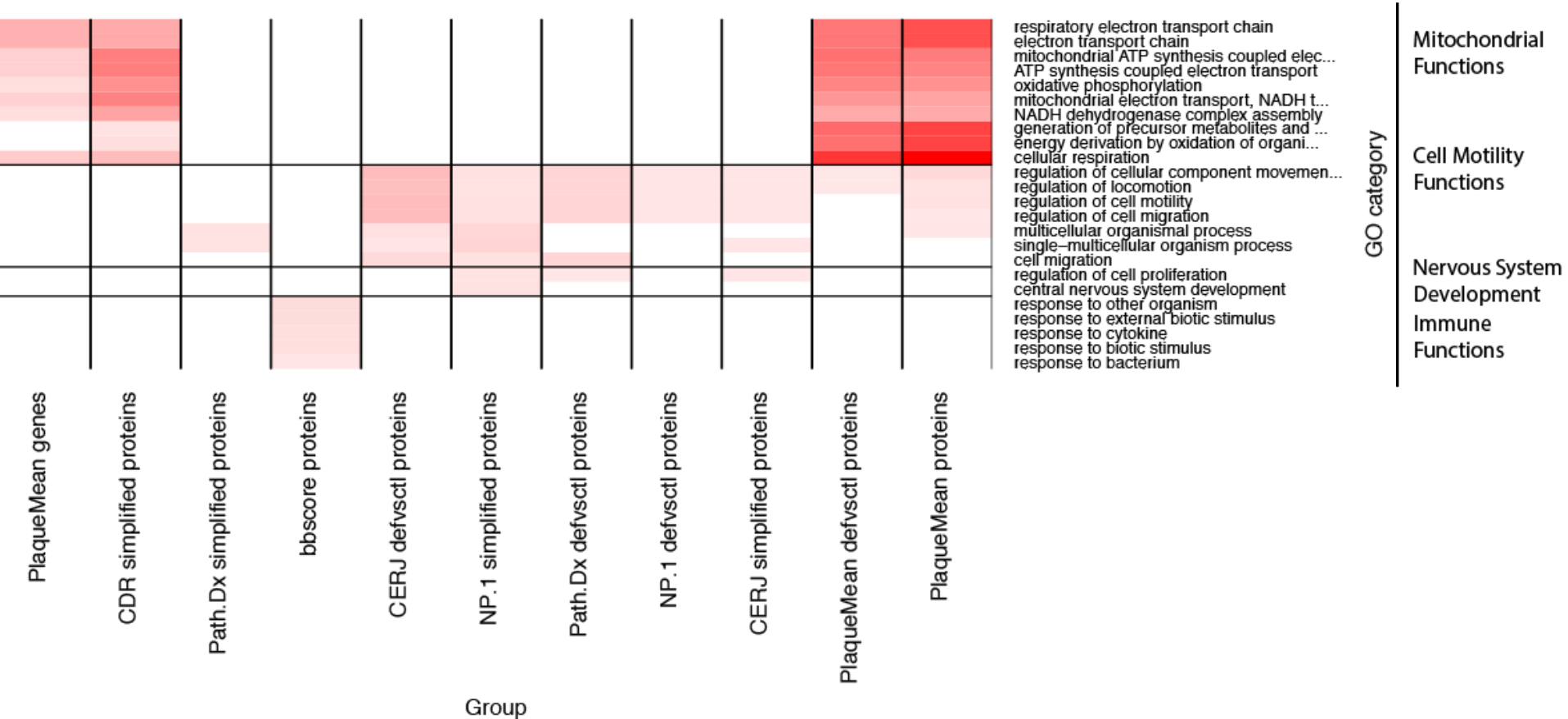
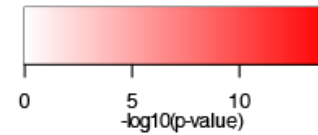
Differential expression



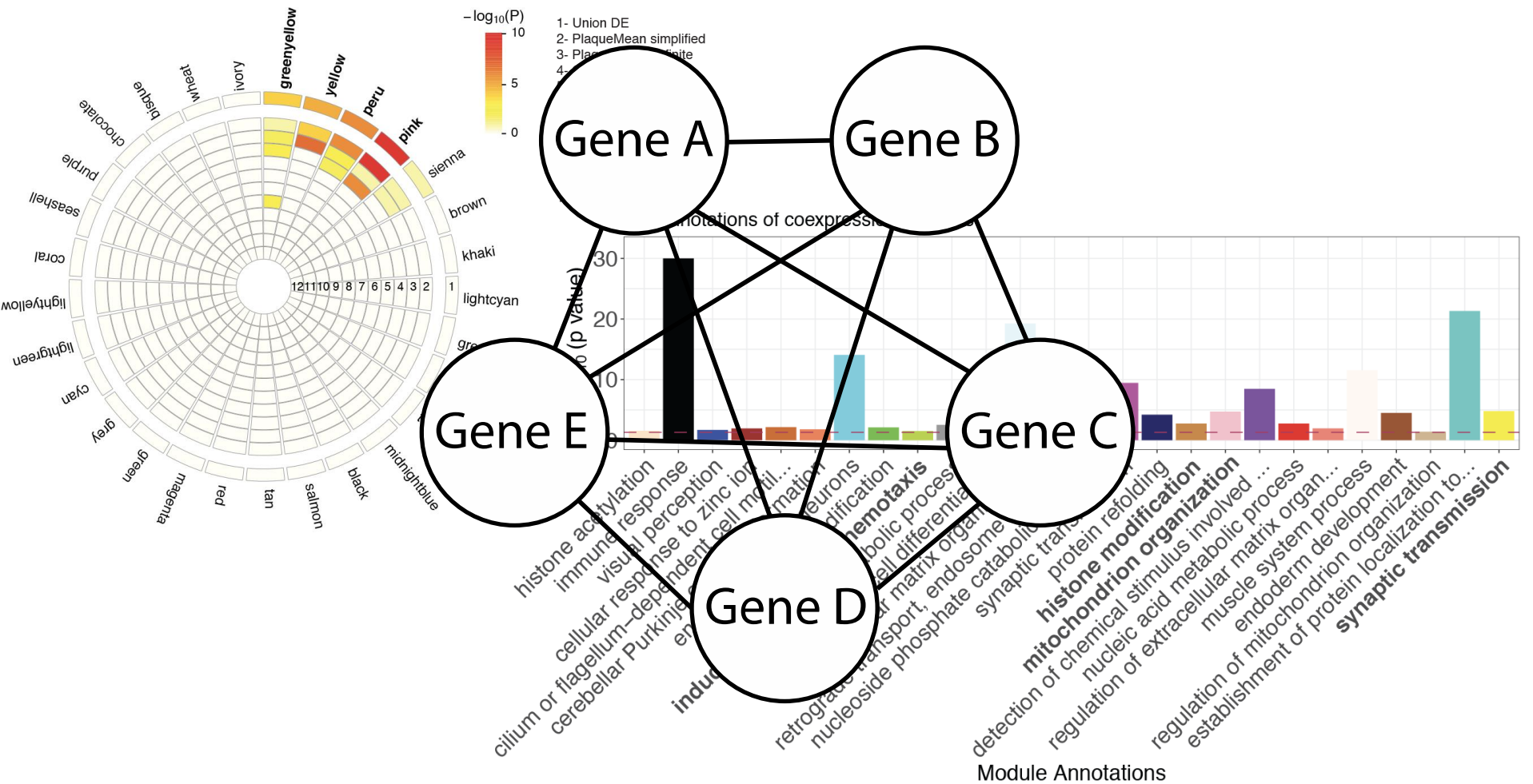
VGF is DE in all traits

# Gene Ontology (GO) enrichments are coherent with known AD pathways

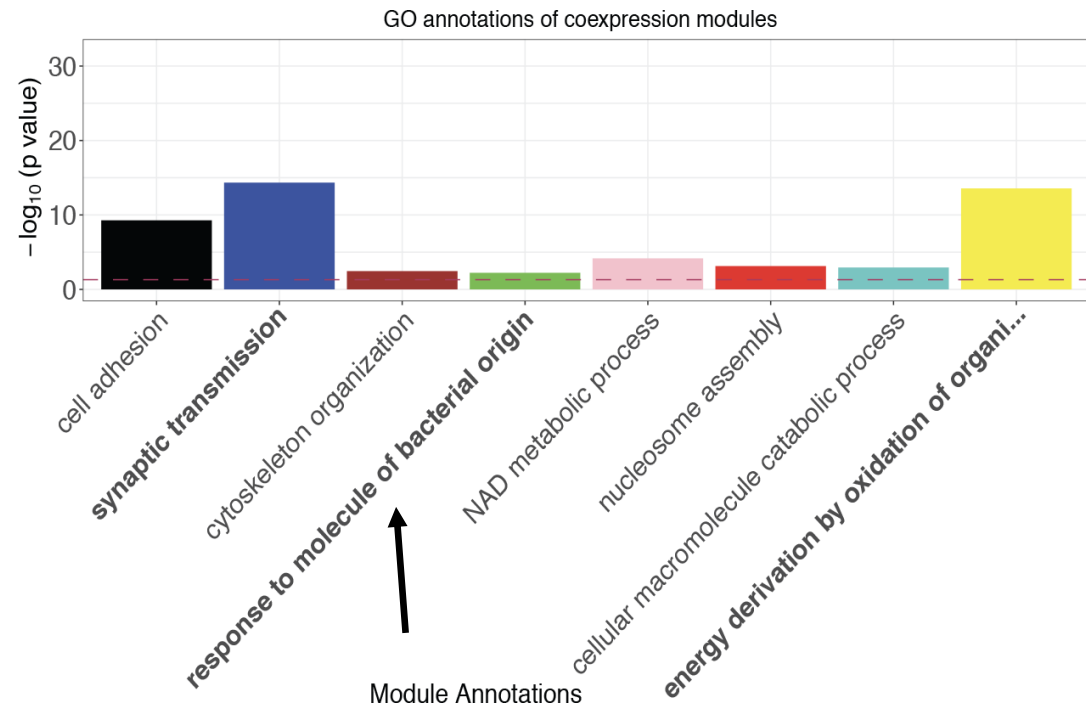
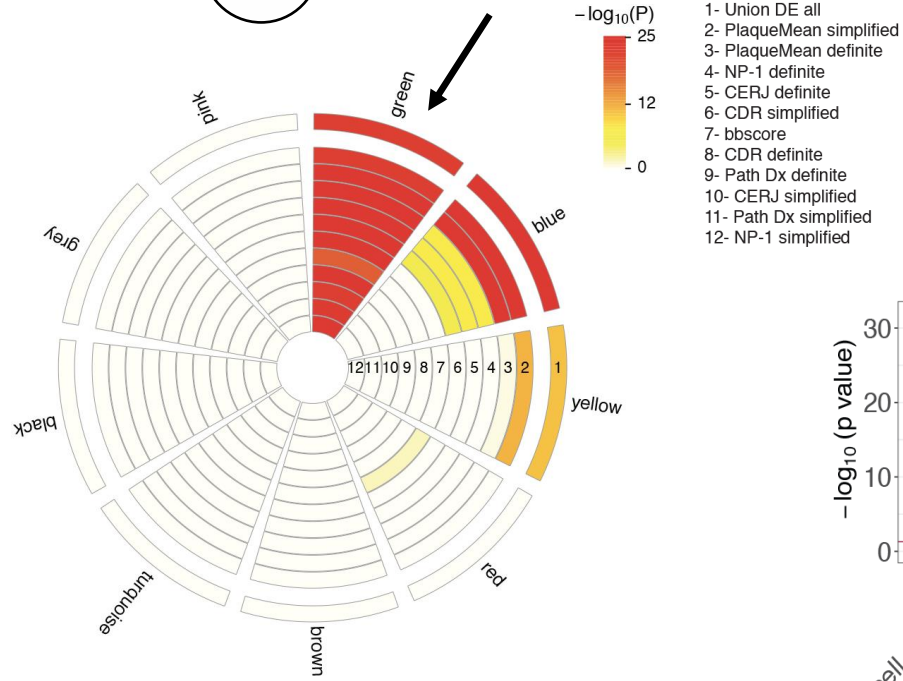
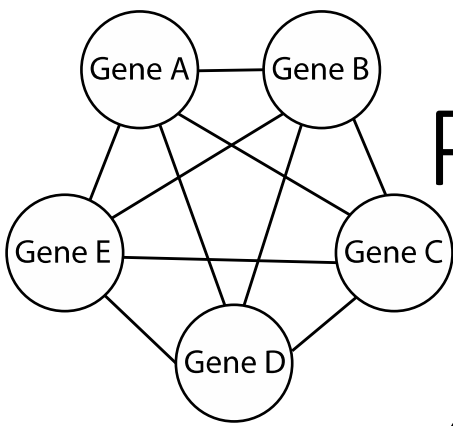
$-\log_{10}$  (p-value) of GO enrichment for each top 5 GO categories



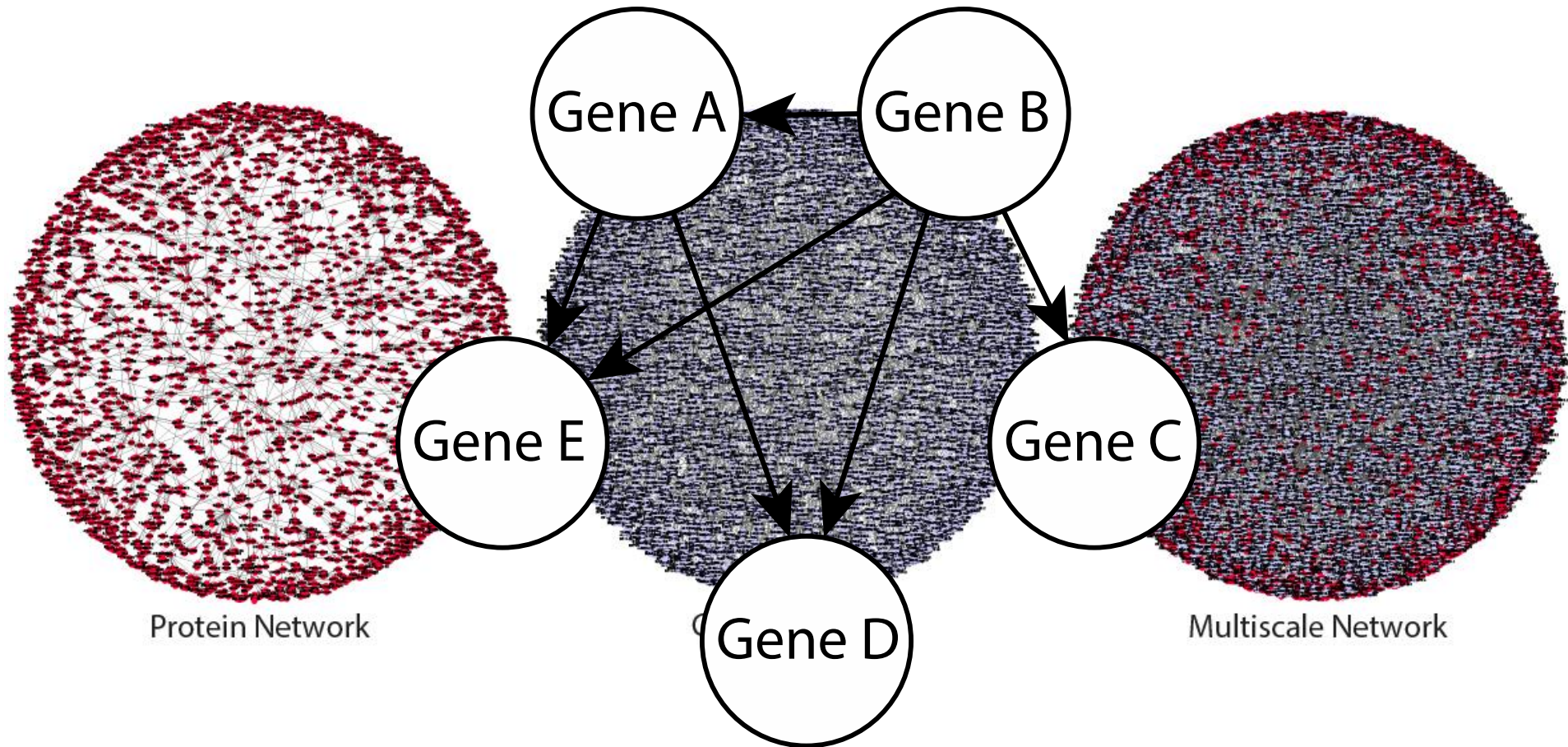
# Gene co-expression network



# Protein co-expression network

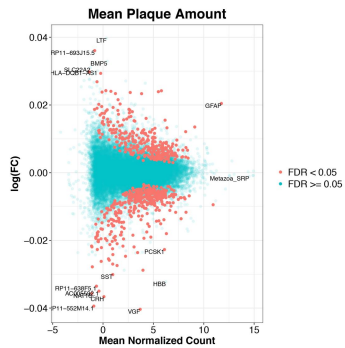


# Bayesian Networks

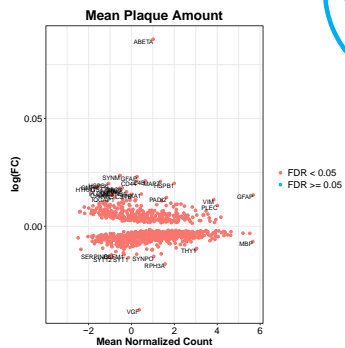


# Key driver (KD) analysis

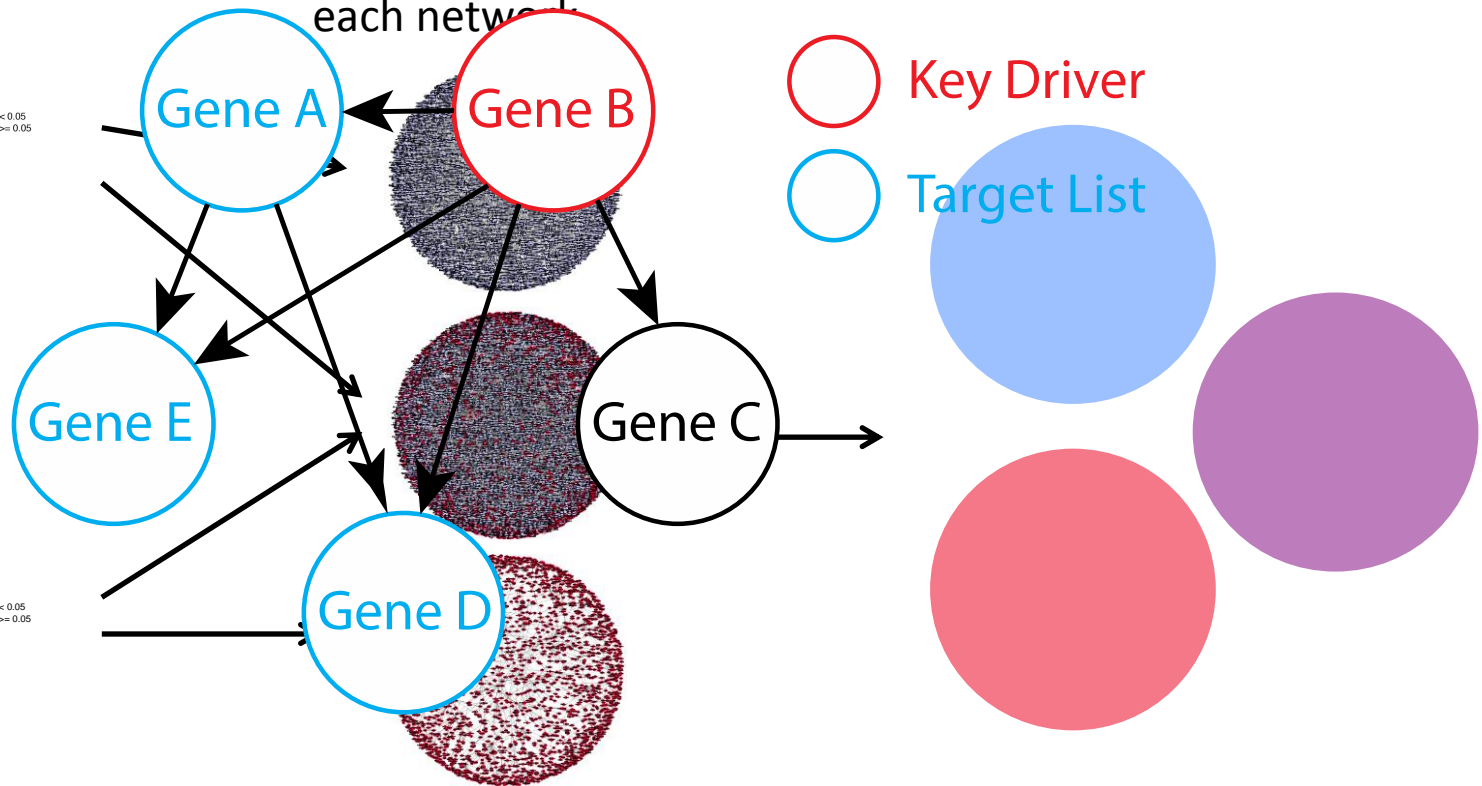
## DE genes



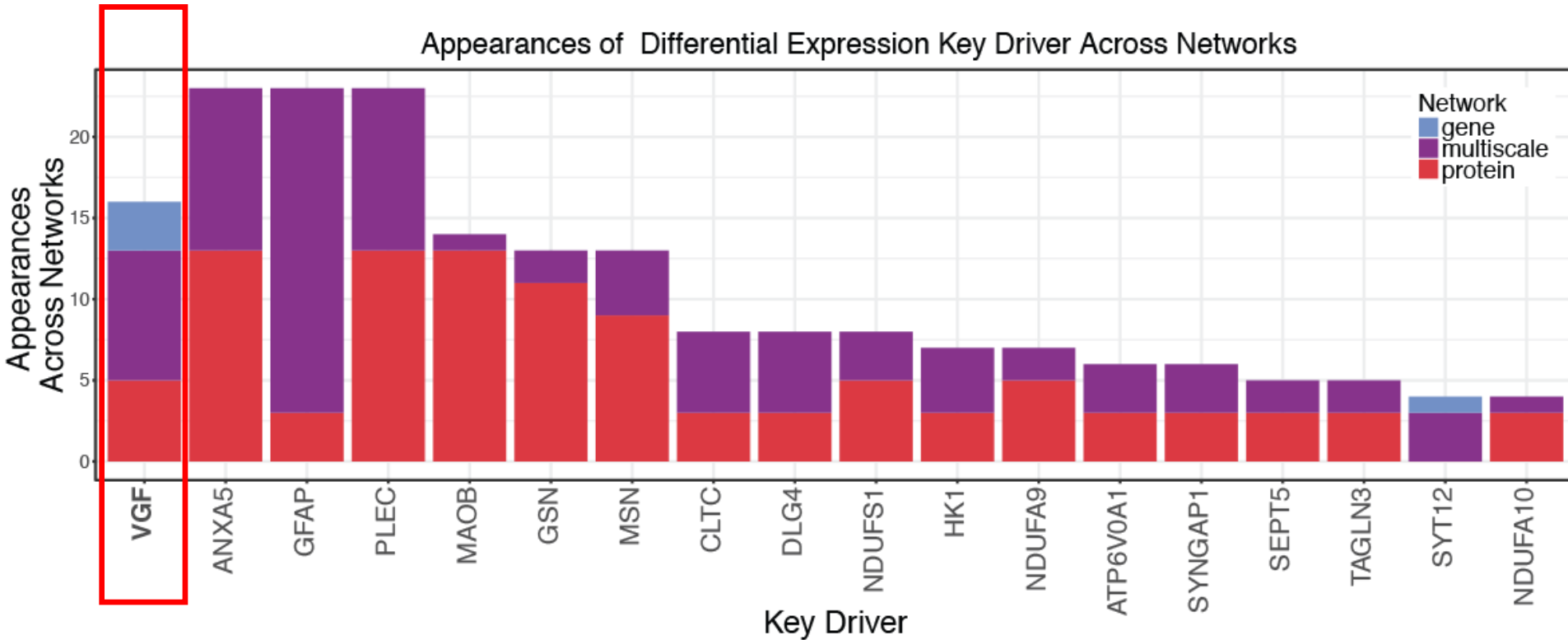
## DE proteins



Detect key drivers in each network



# VGF is a KD of AD



VGF replicated as a KD in:

- MSSM
  - superior temporal gyrus
  - pars opercularis
- ROSMAP
  - dorsolateral prefrontal cortex

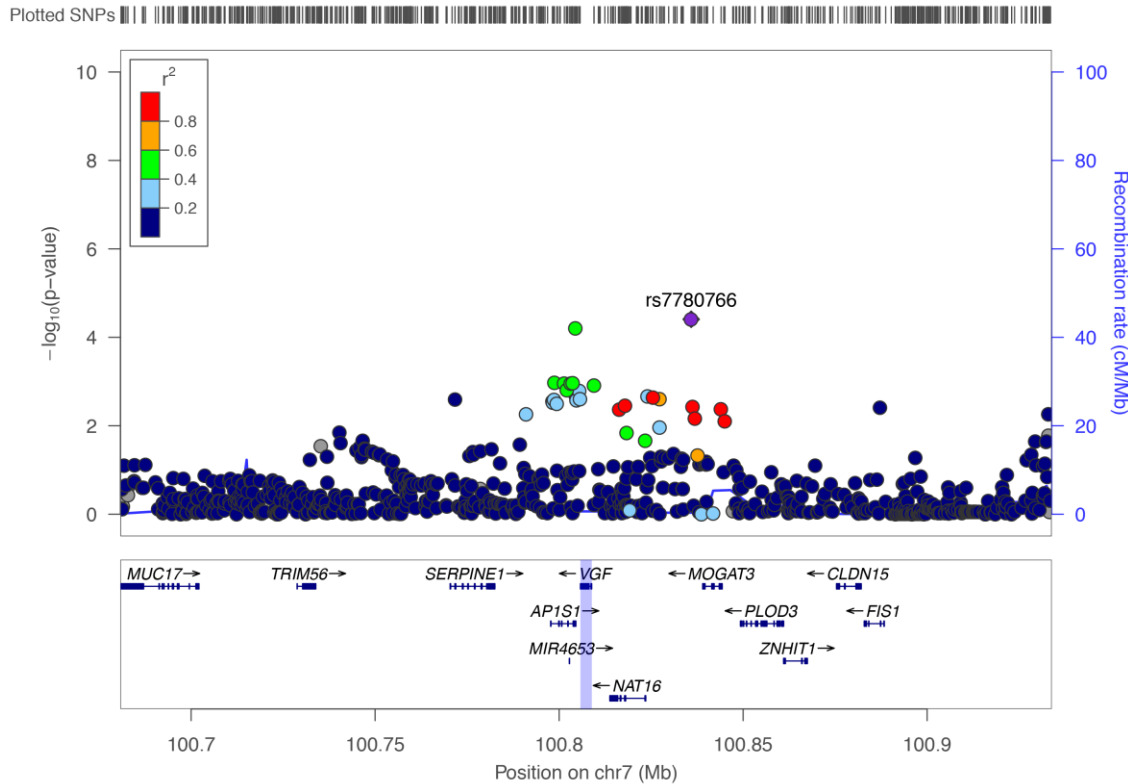
# VGF (nerve growth factor inducible)

- 615 AA precursor protein
- Regulates neural activity and survival
  - Peptide TLPQ-62 regulates memory formation and depression
- Involved in energy balance
  - Peptide TLPQ-21 binds to C3aR1 and has anti-obesity functions
- Downregulated in cerebrospinal fluid of AD patients (potential biomarker)

Levi, A., et al., *Cell Mol Neurobiol*, 2004. 24(4): p. 517-33.  
Thakker-Varia, S. and J. Alder, *Behav Brain Res*, 2009. 197(2): p. 262-78.  
Lin, W.J., et al., *J Neurosci*, 2015. 35(28): p. 10343-56.  
Fairbanks, C.A., et al., *Pain*, 2014. 155(7): p. 1229-37.  
Hannedouche, S., et al., *J Biol Chem*, 2013. 288(38): p. 27434-43.  
Cero, C., et al., *Structure*, 2014. 22(12): p. 1744-1753.  
Cero, C., et al., *Mol Metab*, 2017. 6(1): p. 148-158.  
Hendrickson, R.C., et al., *PLoS One*, 2015. 10(8): p. e0135365.

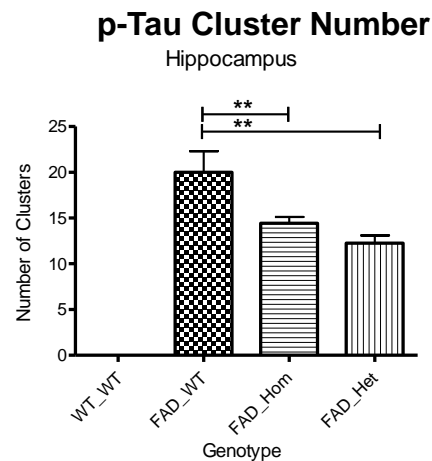
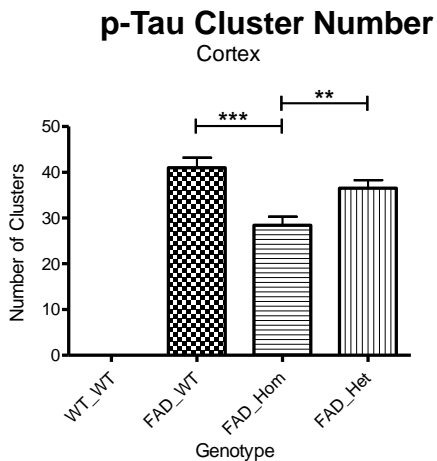
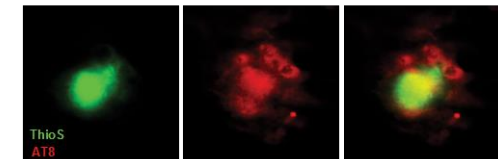
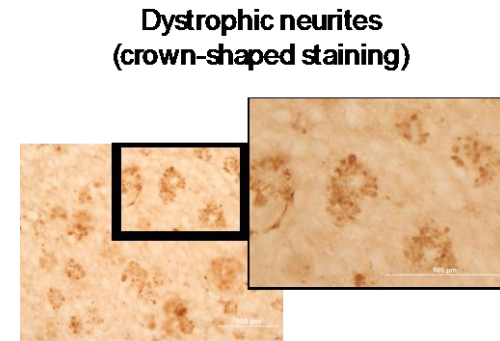
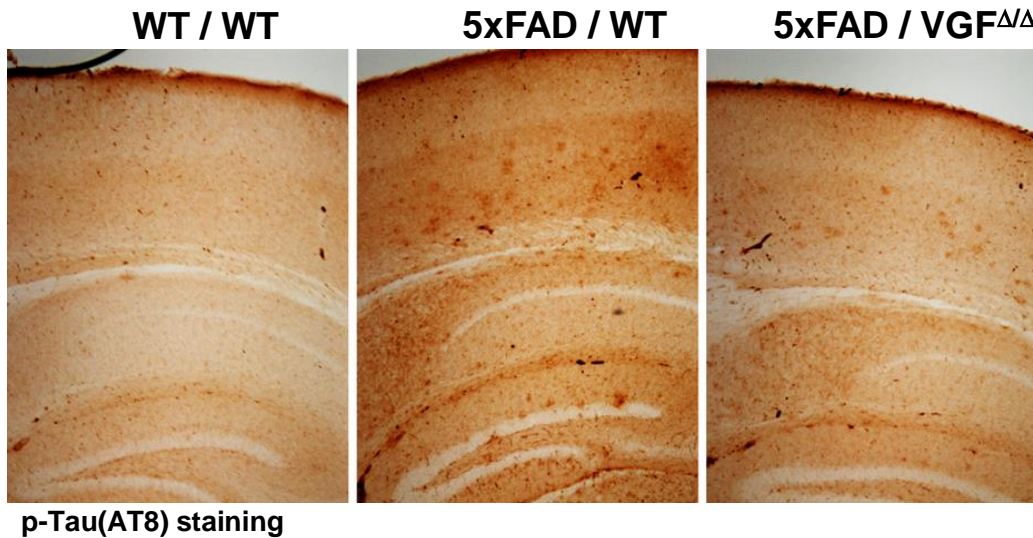


# VGF locus shows signal in GWAS



- Lead SNP p-value:  $3.91e-5$   
(significance-threshold:  $6.9e-5$ )

# Reduced p-Tau and dystrophic neurite clusters in 5xFAD/VGF germline overexpression brains

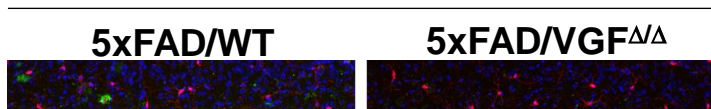


Green: ThioS (plaque)  
Red: AT8 (p-Tau)

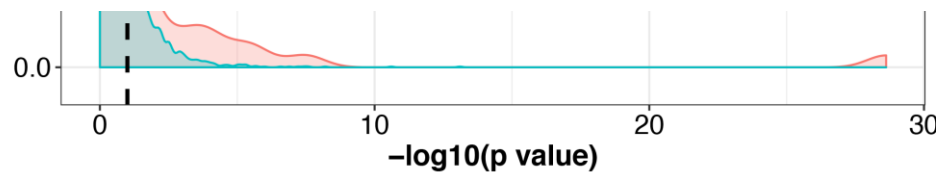
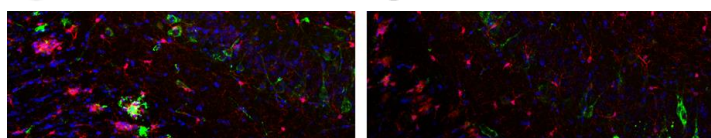
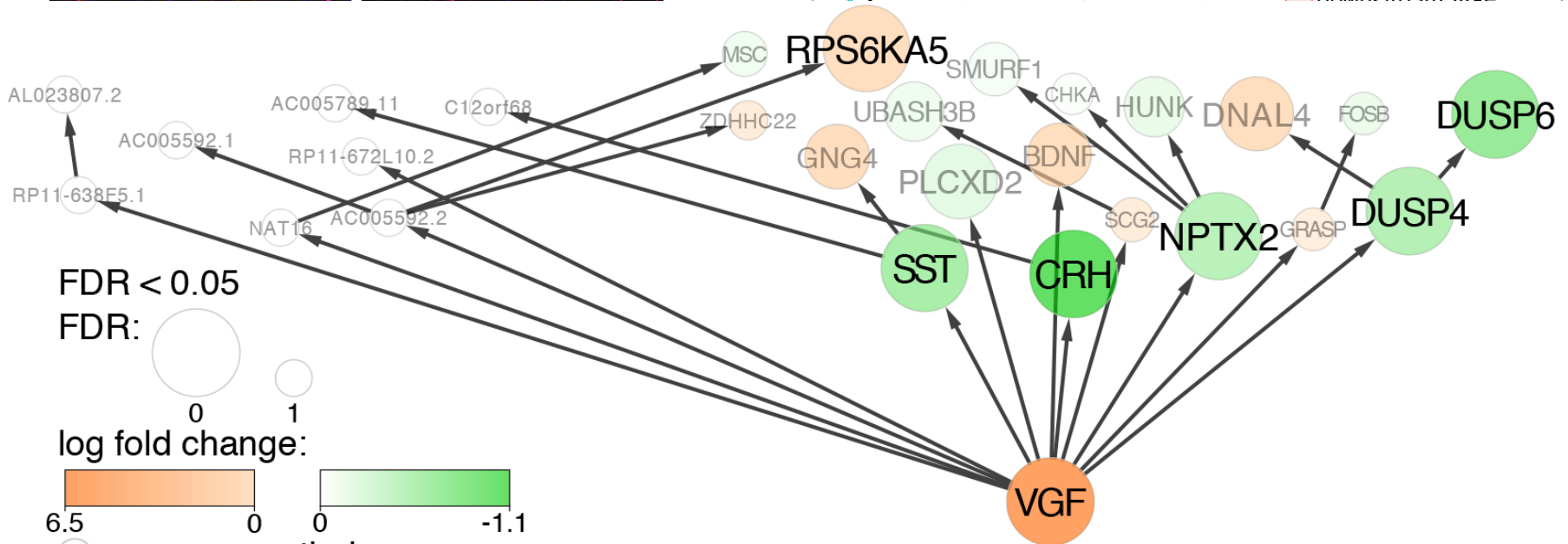
By Jay Lin & Mickael Audrain &  
Siddharth Hariharan

# Functional and Molecular Validation of VGF

Cortex



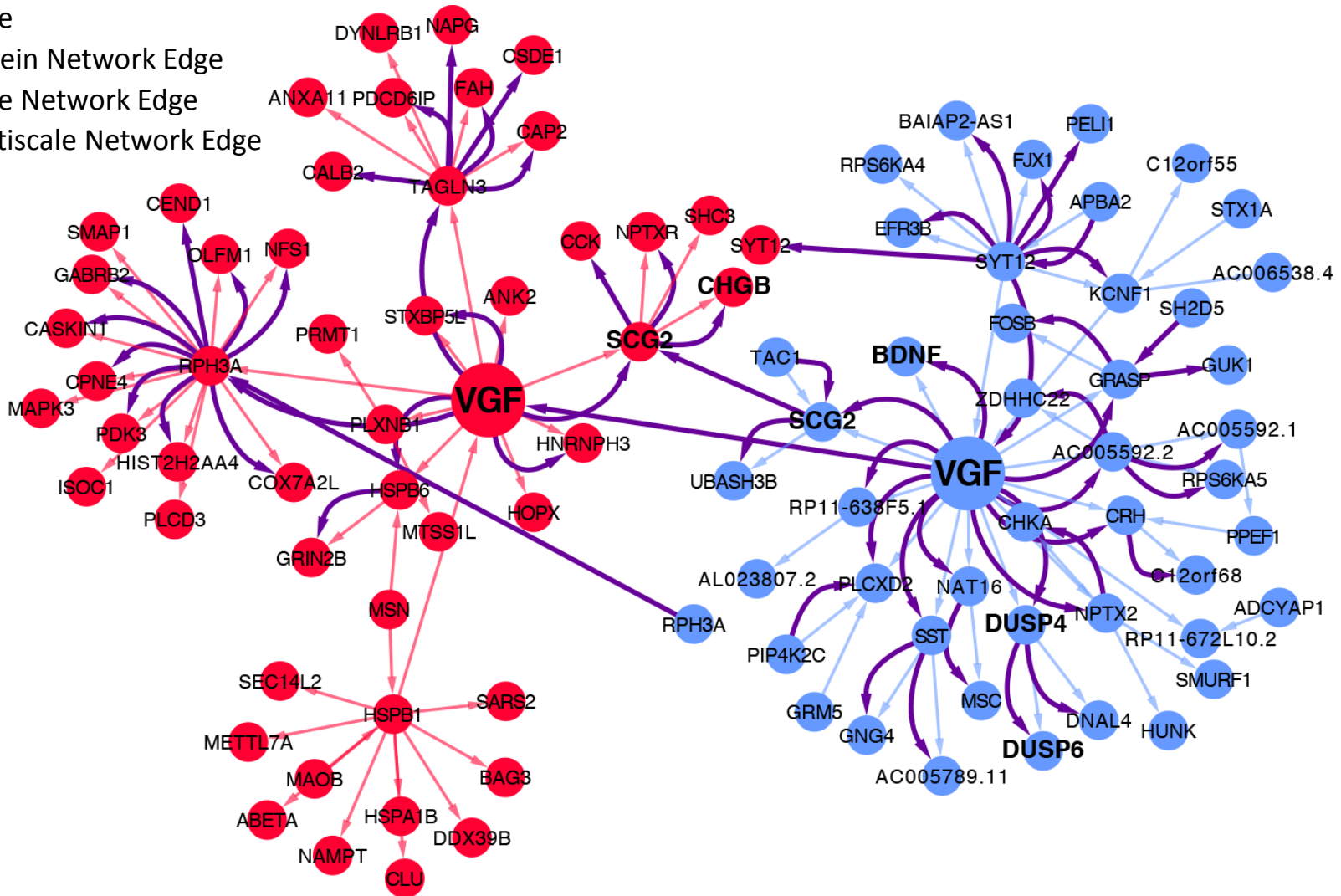
Differentially expressed genes distribution



Green: Abeta (6E10)  
 Red: Iba-1  
 Blue: DAPI

# VGF subnetworks may help inform mechanisms of AD

- Protein
- Gene
- Protein Network Edge
- Gene Network Edge
- Multiscale Network Edge



# Conclusions

- VGF is a new KD of AD
- Most downregulated gene and protein in AD samples
- Replicated in other brain regions
- Replicated in other datasets
- Validated functionally and molecularly
- Subnetwork provides insights into mechanisms

# Acknowledgments

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AMP-AD consortium



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