# MODEL-AD Bioinformatics and Data Management Core

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# **Bioinformatics Overview**

DATA SOURCES	CORE ACTIVITY	NEW RESOURCE
ADSP ADNI IGAP & GWAS	Variant identification	Coding and noncoding candidates
ENCODE/RoadMap AMP-AD Allen Brain Atlas	Variant prioritization	Ranked list of top variants
MouseExomizer HMDC ATAC-seq	Human-to-mouse variant translation	New genetic models
AMP-AD ADNI M <sup>2</sup> OVE-AD	Mouse-to-human phenotype mapping	Validated AD mouse models
MODEL-AD	Data distribution	Expanded AMP- AD Knowledge Portal







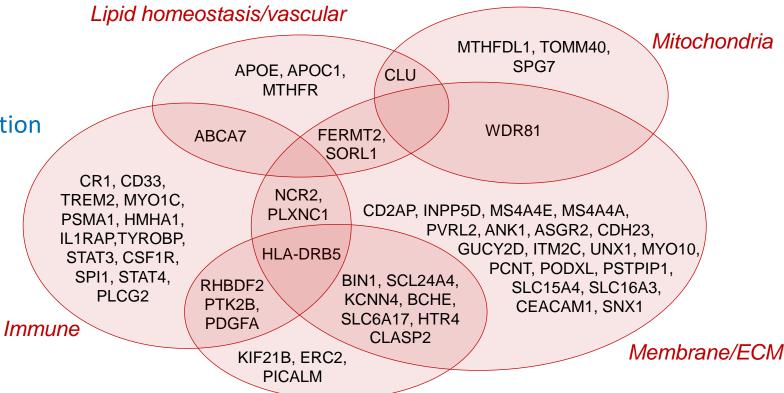




### Variant Prioritization

#### Systematic assessment of LOAD loci

- Significance in multiple studies
- Predicted effect on function
- Human-mouse sequence conservation
- Differential expression in AD
- Noncoding variant effects
  - ➤ Ali Mortazavi, UCI BDMC



Synaptic Signaling











# Variant Summary Metrics

Gene	significant association	SNP/gene replication	pathogenic	conserved	differential expression in AD	AD biology
EXO5	<b>(</b>	<b>⊘</b>	$\otimes$	$\bigcirc$	$\bigcirc$	,
CLASP2	<b>⊘</b>	<b>⊘</b>	<b>⊘</b>	<b>⊘</b>	$\bigcirc$	Reelin Signaling
MS4A6E	<b>⊘</b>	$\bigcirc$	$\otimes$	$\otimes$	?	?
SORL1	<b>⊘</b>	<b>⊘</b>	<b>⊘</b>	<b>⊘</b>	$\bigcirc$	Retromer Trafficking
PLCG2	<b>(</b>	<b>③</b>	<b>⊘</b>	<b>&gt;</b>	↔	,
MAPT	<b>⊘</b>	<b>⊘</b>	$\otimes$	$\otimes$	⊗	Tau pathology
MTMR4	<b>⊘</b>	<b>⊘</b>	<b>⊘</b>	<b>⊘</b>	$\bigcirc$	TGF-beta signaling
SHC2	<b>⊘</b>	<b>⊗</b>	<b>⊘</b>	<b>⊗</b>	⊗	?



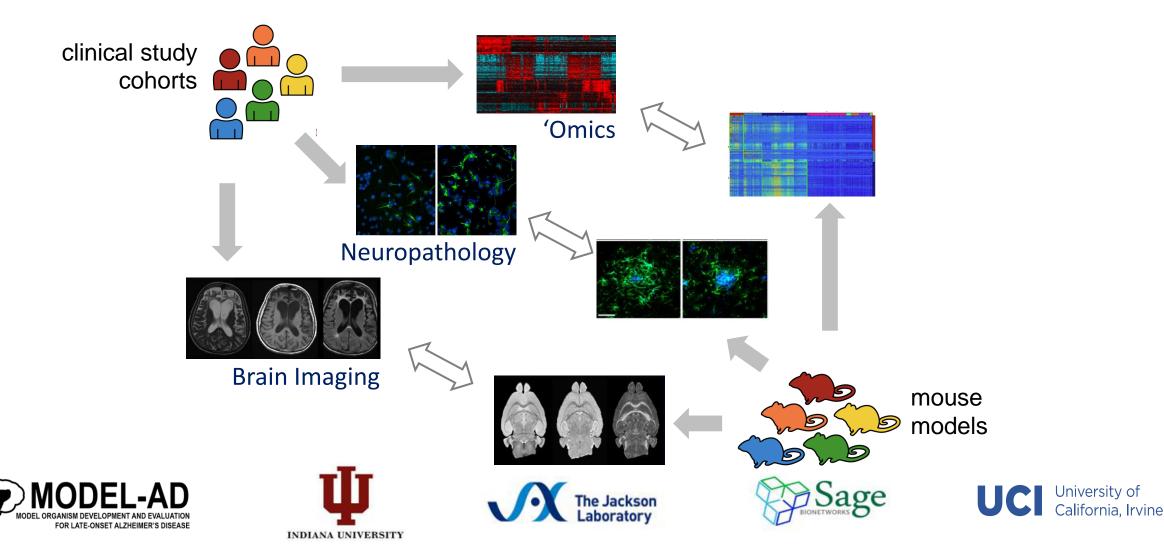








# Cross-Species Phenotype Alignment



# Human Genomics of AD via AMP-AD

Study	N	Brain Regions		
ROS/MAP	700	THE PARTY OF THE P	dorsolateral prefrontal cortex	
Mt Sinai Brain Bank	300		frontal pole superiortemporal gyrus parahippocampal gyrus inferiorfrontal gyrus	
Mayo Clinic	270		cerebellum temporal cortex	





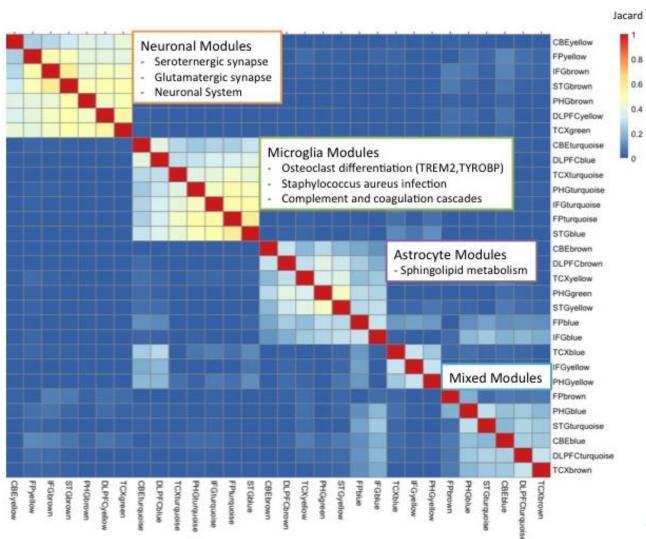


AMP-AD Knowledge Portal





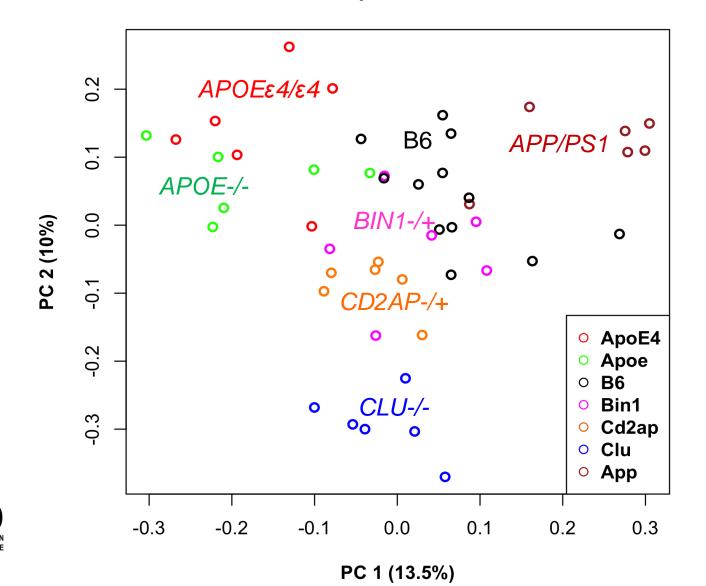
# AMP-AD Gene Modules



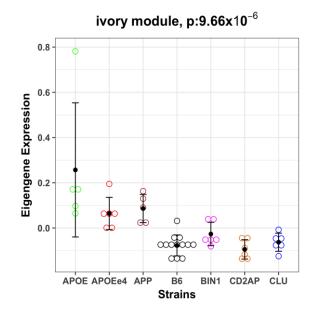


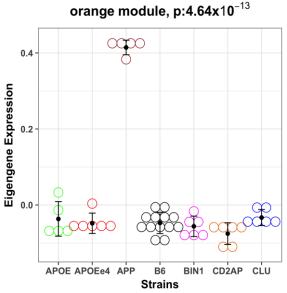
Ben Logsdon Sage Bionetworks

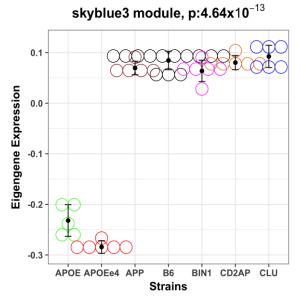
# Mouse Model Transcriptomes

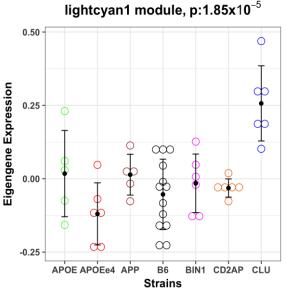


# Mouse Gene Modules via WGCNA



















# Mouse Gene Modules via WGCNA

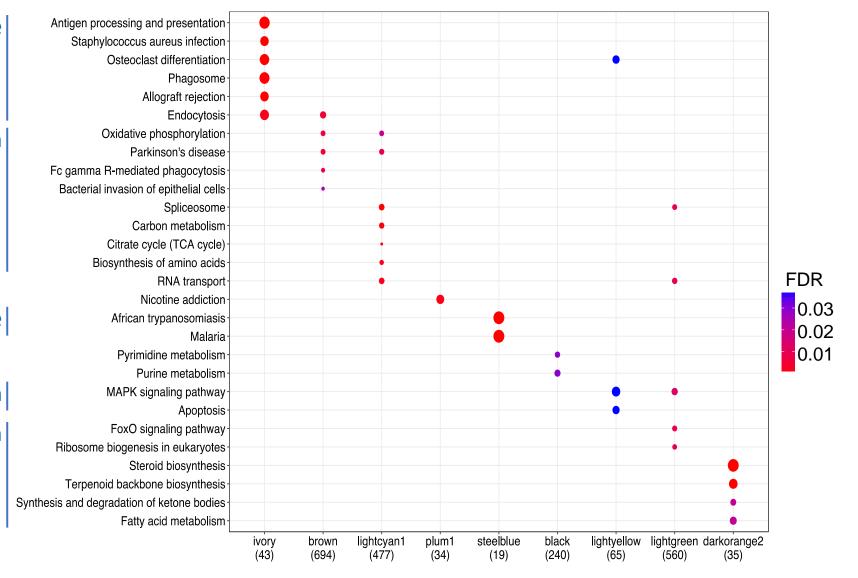
neuroimmune

neurometabolism

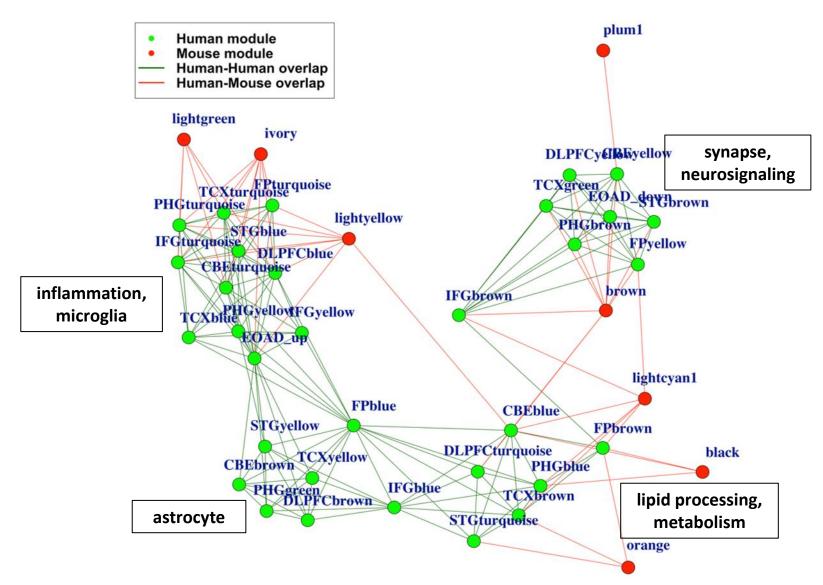
immune

cell death

lipid metabolism



# Human-Mouse Transcriptome Alignments



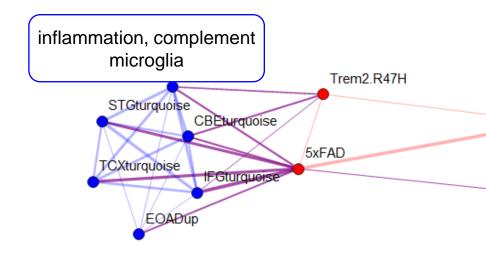
# nanoString Neuropath Analysis

• 5xFAD, APOE4, and APOE4.TREM2<sup>R47H</sup>

Six months of age, whole brain

Three female replicates

• Compared to 30 AMP-AD modules



glycolysis, gluconeogenesis negative regulation of neuron apoptosis **HUMAN MODULE** MOUSE GENE SET **HUMAN-HUMAN OVERLAP HUMAN-MOUSE OVERLAP** MOUSE-MOUSE OVERLAP **PHGbrown** ApoE4 DLPFCyellow **EOADdown** synaptic, BNDF signaling cortex **PHGblue** 







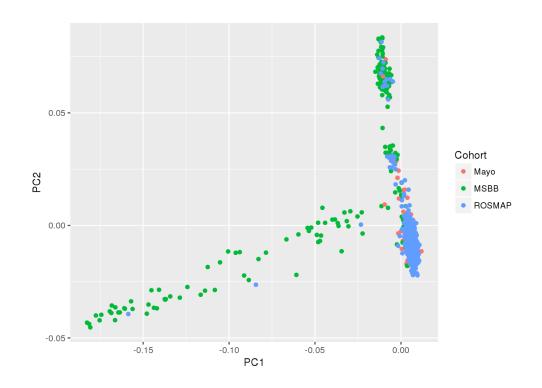




# Integrating AMP-AD WGS Data

Imported 1800+ whole genomes from AMP-AD Knowledge Portal

- QC checks for quality scores, sample duplication, etc
- LD pruning, MAF filtering
- PCA for population structure
- Comparison to 1000 Genomes to validate populations









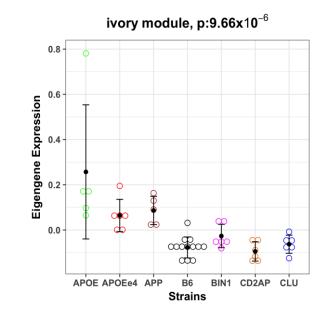




# Human-Mouse Neuroimmune Similarity

#### Ivory mouse module

- Upregulated in ApoE<sup>-/-</sup>, ApoE4,
   APP/PS1 mice
- Overlap with human immune modules from AMP-AD ( $p = 10^{-29}$ )
- Contains TYROBP, TREM2, C1QA, CSF1R



MODEL-AD

AMP-AD

**Human Variants** 

SNPs in *TREM2*, *CSF1R*, etc.



**Human Module** 

mRNA of *TYROBP, TREM2*, etc.



Mouse Module

mRNA of *TYROBP, TREM2*, etc.



Mouse Models

ApoE-/-, ApoE4, APP/PS1







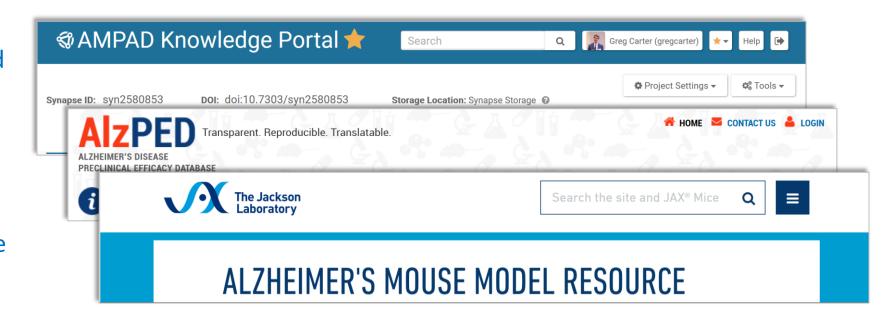




### Data Dissemination

#### Data sharing online

- Mouse genetic information: variant(s), strain background
- Mouse phenotype data: RNA-seq, imaging, etc.
- Preclinical data: standards, protocols, results
- Preclinical results searchable on AlzPED













#### **UCI BDMC Activities**

- 1. Support variant identification and prioritization
  - Focus on non-coding variants
  - Coordinate with IU/Jax/SAGE
- 2. Reanalyze publicly available data to support variant prioritization in mouse
- 3. Analyze UCI RNA-seq data produced by center
- 4. Submit RNA-seq results to Synapse



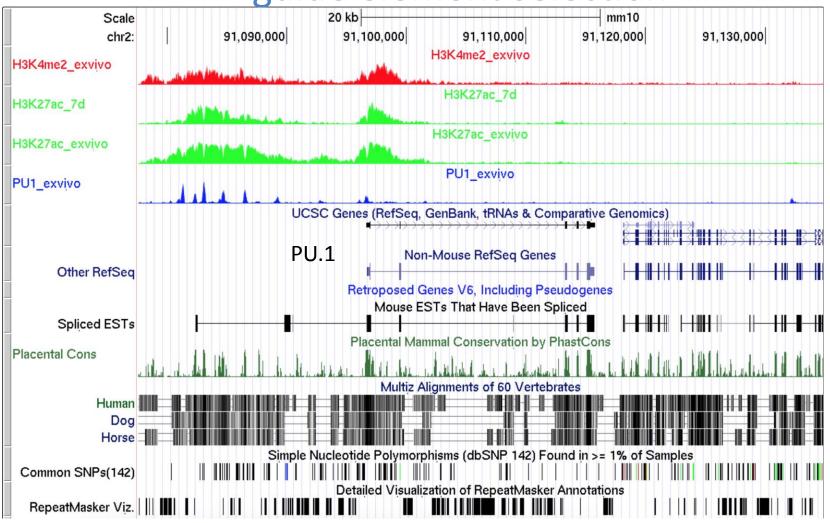






# Using publicly available chromatin marks in mouse to

guide element selection





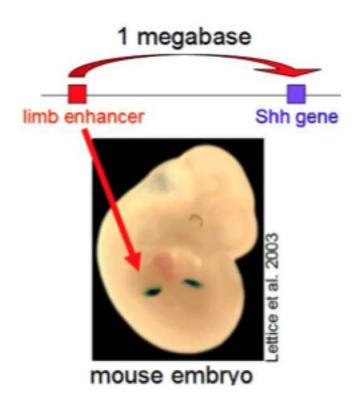






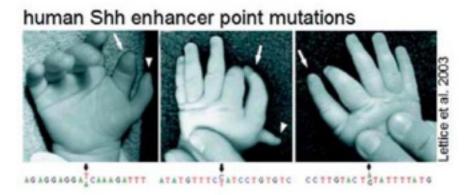


# Enhancers controlling gene expression can be very far from their gene



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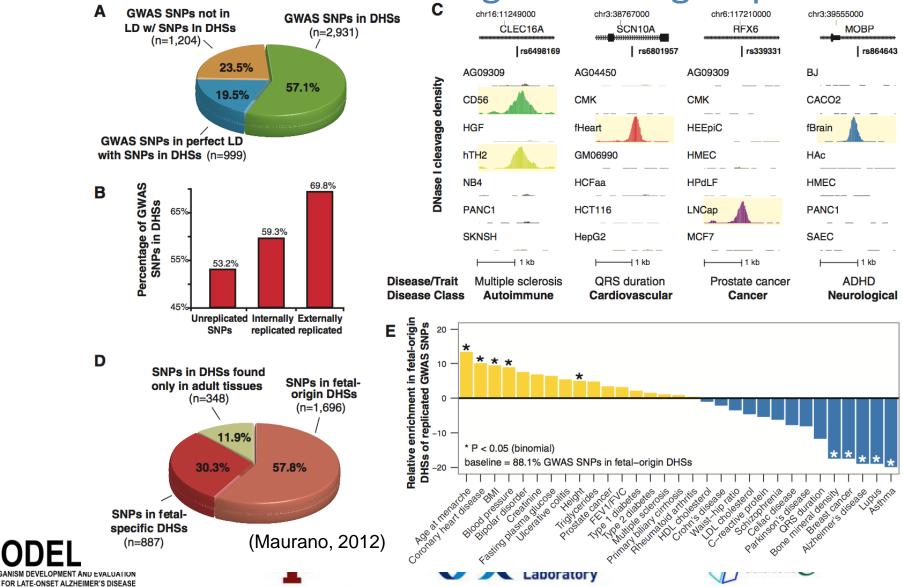




To complicate matters, the Sonic Hedgehog limb enhancer is in the intron of another gene that it does not regulate Sage



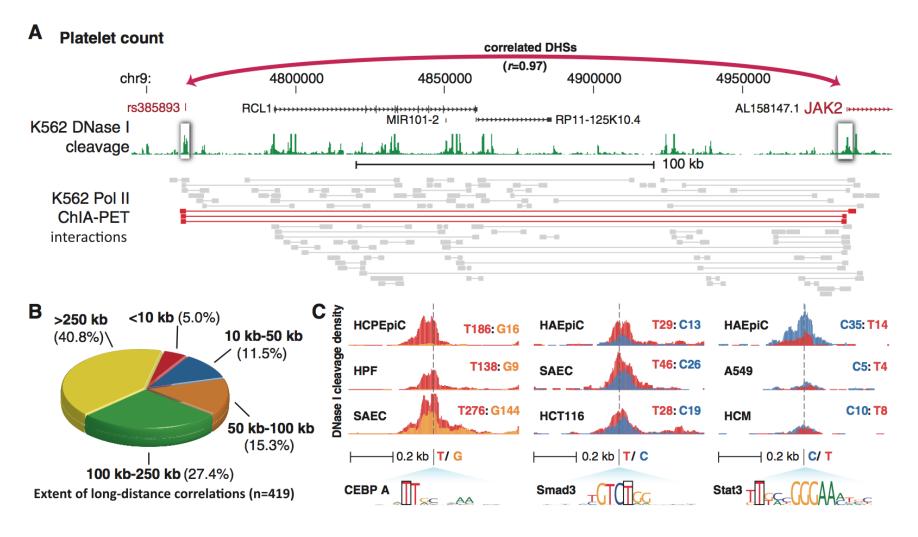
# Majority of GWAS SNPs map to open chromatin elements outside of gene coding sequences



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#### Distal GWAS SNPs mapping to cognate promoters







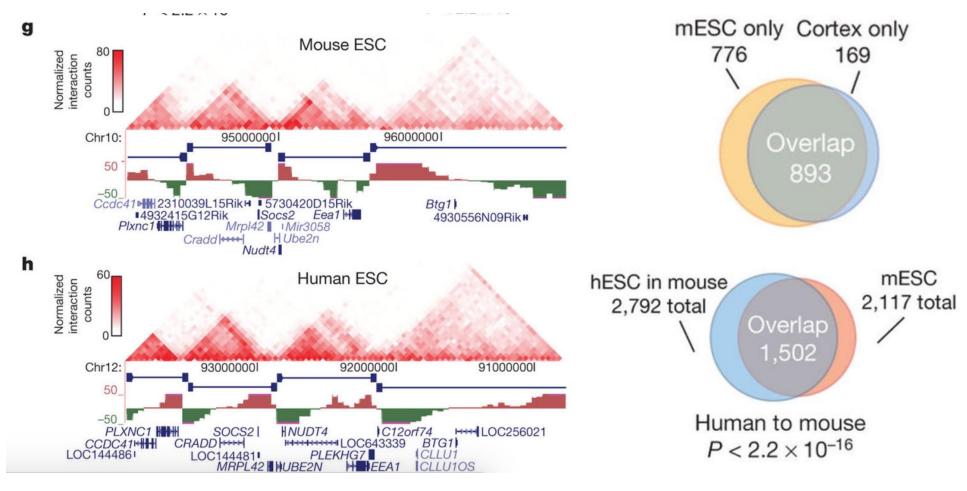








# Topologically associated domains defined by HiC identify interacting regions



From Dixon, 2013



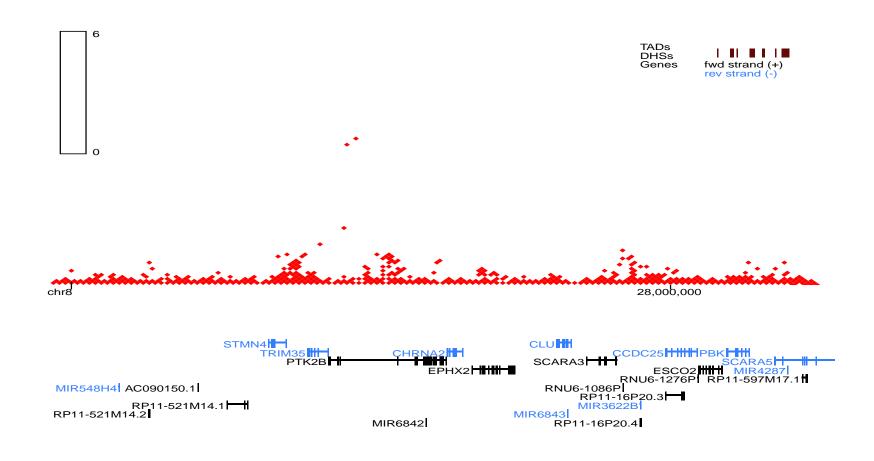








#### Some of the GWAS hits are on the same TAD – do they interact?





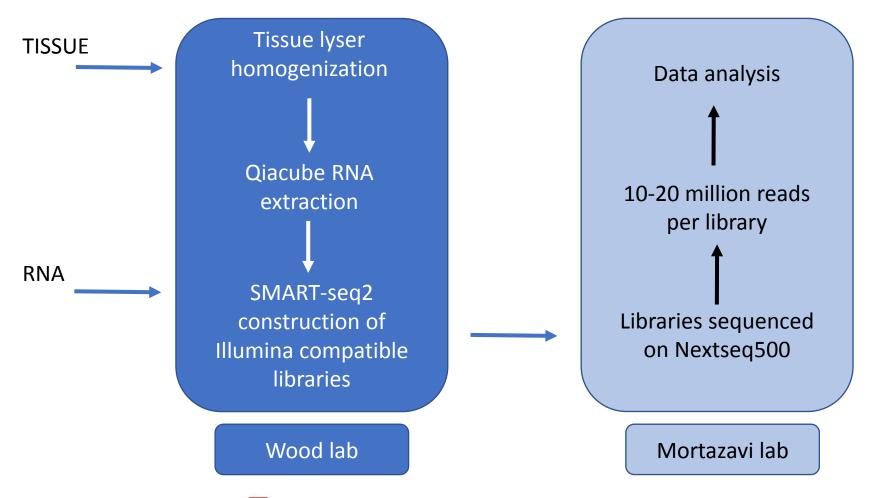








### RNA SEQUENCING PIPELINE













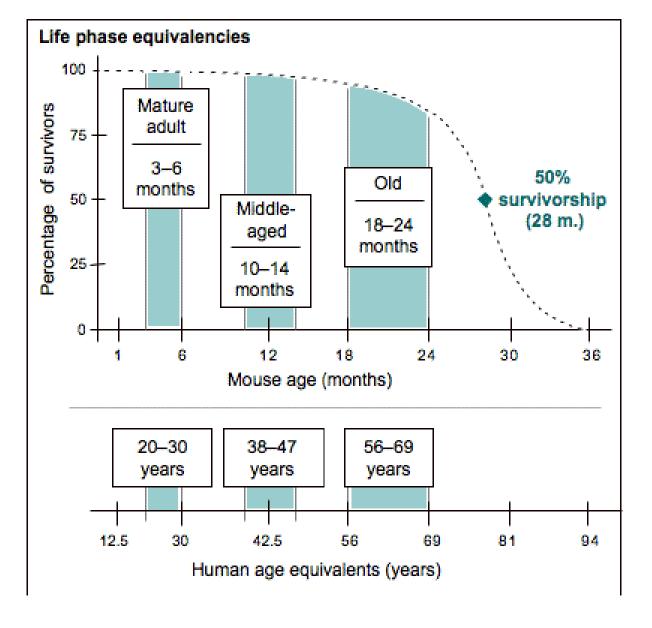
# Mouse versus human ages

- 2 month old BL6 mouse would correspond to a teenager
- 8 month old BL6 mouse would correspond to a 35 year old human
- 22 month old BL6 mouse would correspond to a 65 year old human
- RNA-seq data in young mice 

   early disruption and biomarkers
- RNA-seq data in older mice → better match to to LOAD ?







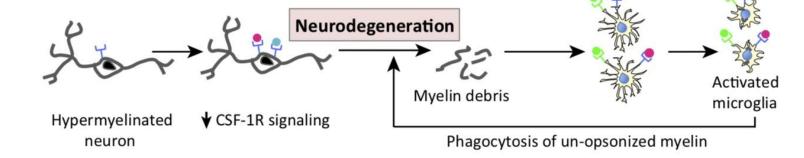






#### CSF1R+/- het mice have:

- Impaired memory
- Normal brain size
- Impaired myelination
- Increased microglia



(B)

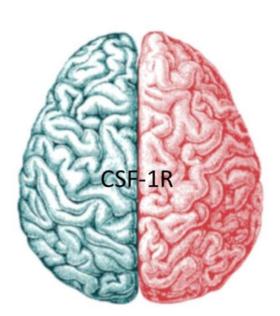
#### Positive role

Survival and quiescence of microglia

Differentiation of neurons and glial cells

Neuronal survival

Improved neurogenesis; clearance of myelin debris and remyelination (GCL)



#### Negative role

Expansion of demyelinating MΦ and microglia; schwann cell dedifferentiation (CMT1X)

Increased myeloid cells and autoimmune responses (EAE)

Glioma progression

(Chitu, 2016)



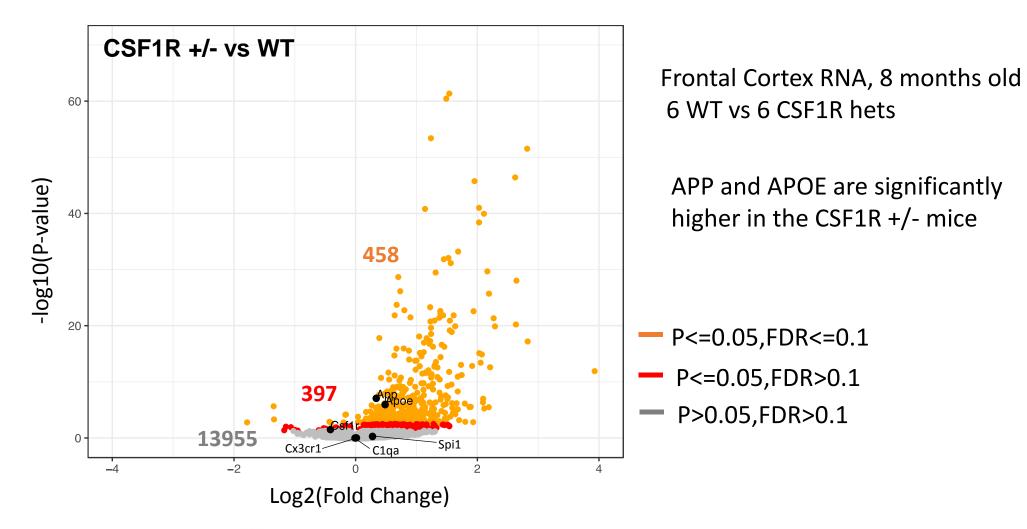








# **Differential Expression Analysis**







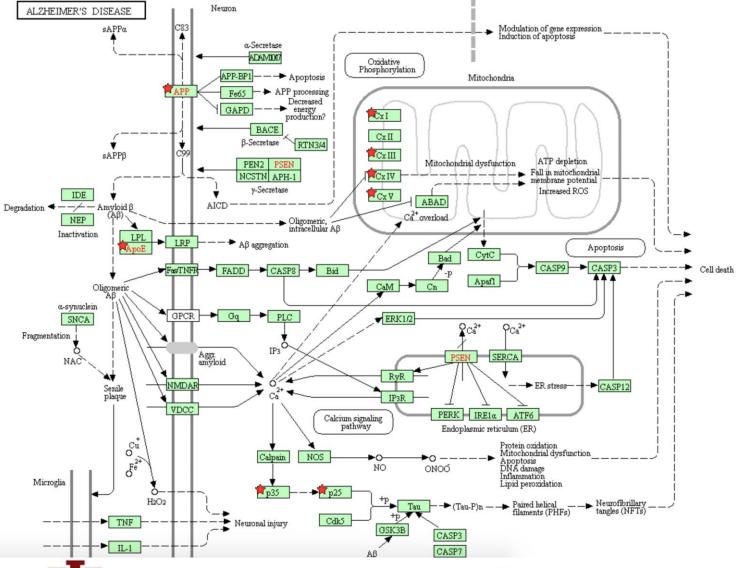






Pathway analysis flags AD among others

David P-value 1.9E-3 FDR 7.5E-2













# Humanizing $A\beta$ as a platform to introduce GWAS variants



Alzheimer's
Association
International
Conference (AAIC)
O #23414

**O1-01** Development of New Models and Analysis Methods: Novel Model Systems to Study Dementia, *Sunday*, *July 22, 2018:* 8:00 AM - 9:30 AM, McCormick Place, Room - 184 **O1-01-04** Haβ-KI: A Knock-in Mouse Model for Sporadic Alzheimer's Disease





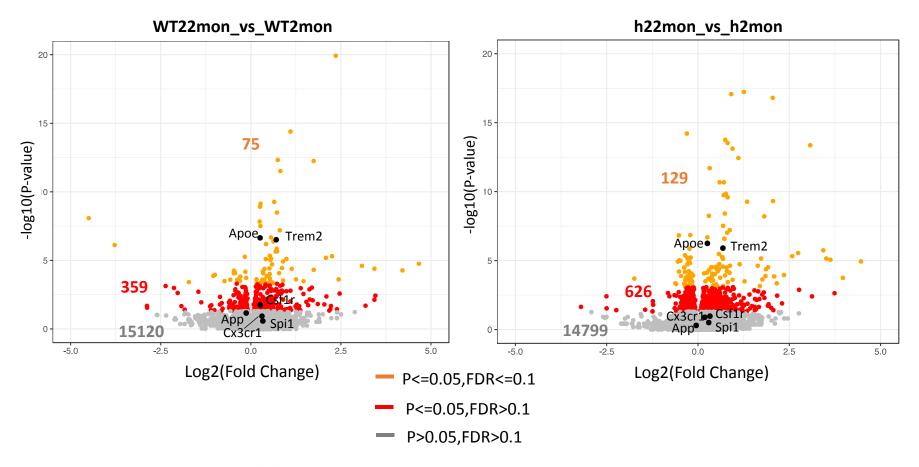






# Differential expression analysis of hAβKI vs WT by age

2 genotypes x 2 time-points x 2 sexes x 2 replicates = 32 mice





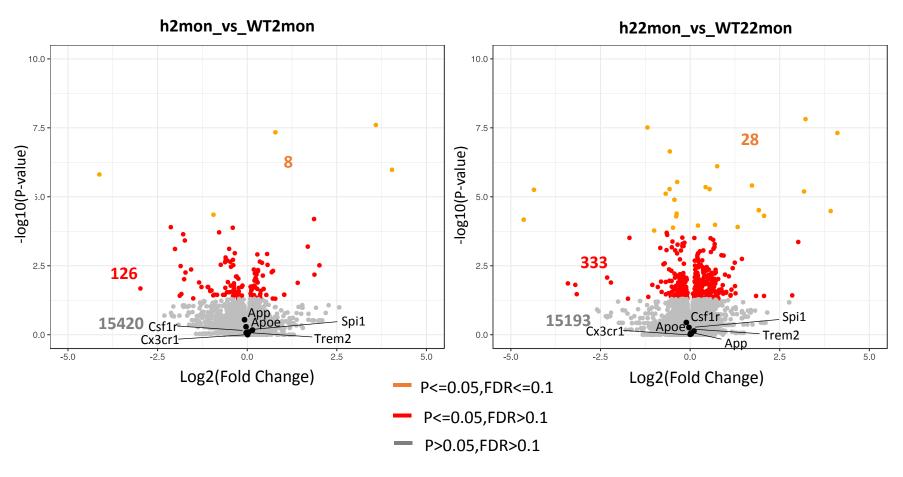








# Differential expression analysis of hAβKI vs WT by genotype



Talk by David Baglietto-Vargas



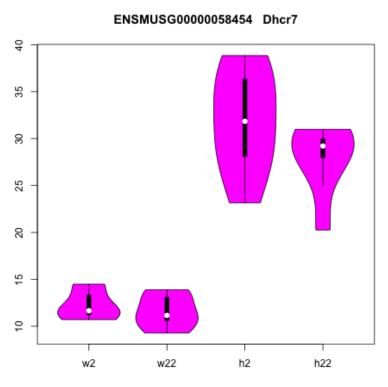








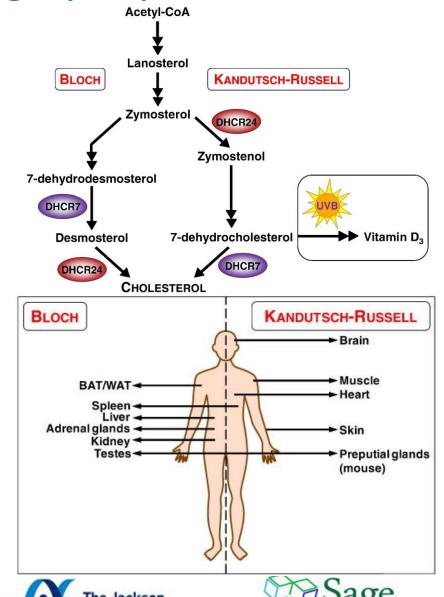
# DHCR7 is more highly expressed in hAbKI



- Last enzymatic step in cholesterol synthesis in the adult brain
- What is the cell type overexpressing Dhcr7?







From Prabhu, 2016



#### **Upcoming UCI BDMC Activities**

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  - Focus on non-coding variants
  - Coordinate with IU/Jax/SAGE
- 2. Reanalyze publicly available data to support variant prioritization in mouse
- 3. Analyze UCI RNA-seq data produced by center
- 4. Submit RNA-seq results to Synapse
- Analyze single-cell RNA-seq data from aging WT and AD mouse models









