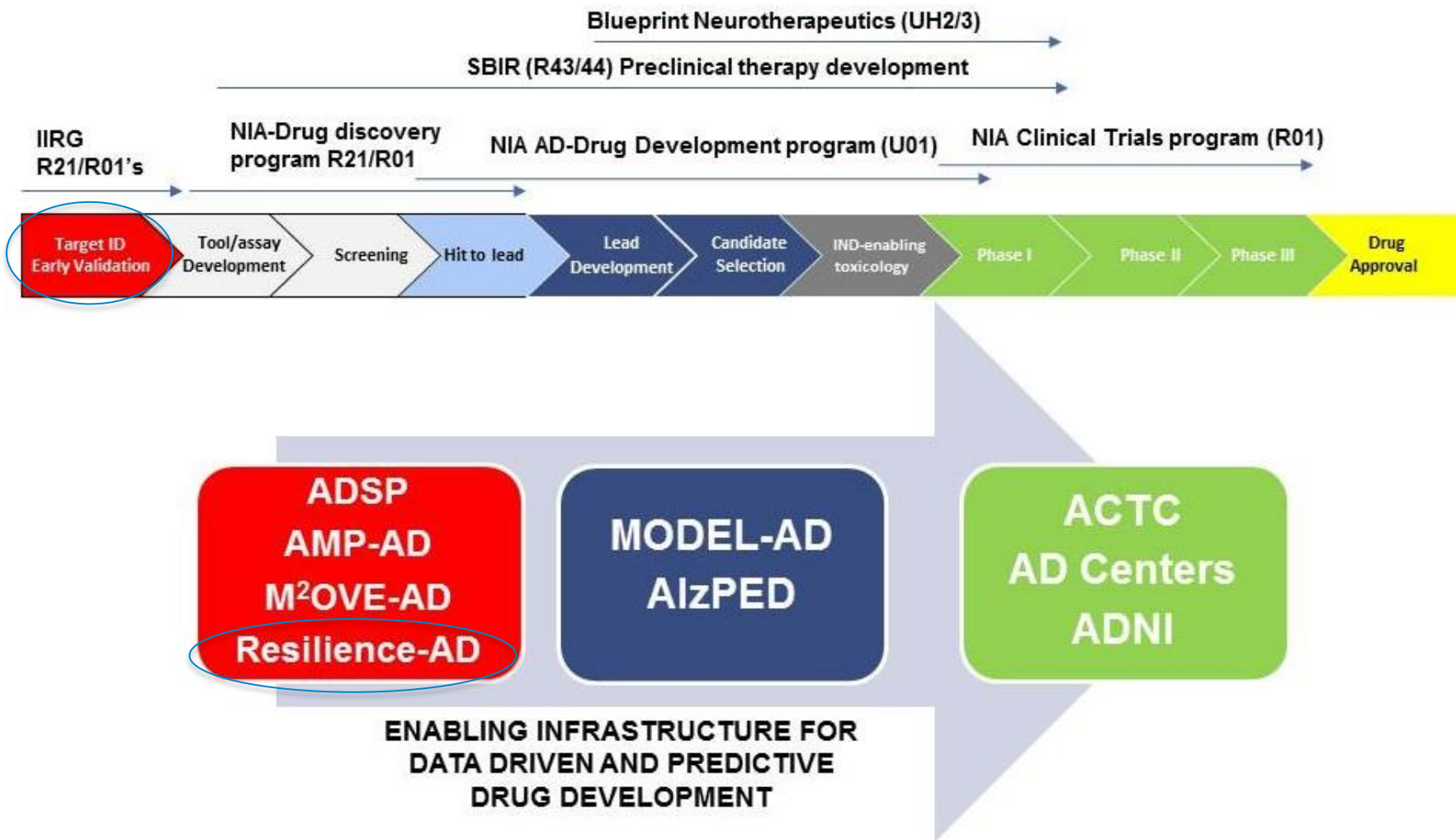


NIA and Trans-NIH translational pipeline for AD and ADRD



Understanding the Complex Biology of Resilience to AD

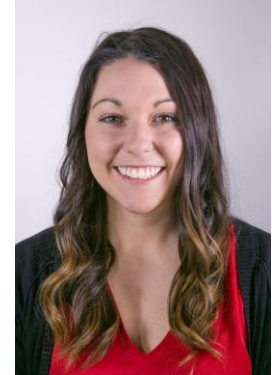
RFA-AG-17-061

- Morgan Levine, *Yale*: Identify underlying biological interactions and networks that explain why some e4 carriers do not develop Alzheimer's disease.
- Sean Bendall, *Stanford*: *Multiplexed imaging to define resilience to AD.*
- Catherine Kaczorowski, *The Jackson Laboratory*: Discovery of genetic modifiers to high-risk AD mutations using mouse populations that model humans
- Nir Barzilai, *Einstein School of Medicine*: Discovery of longevity and resilience genes through population studies of Ashkenazi Jews.
- Chris Gaiteri, *Rush*: The goal of the proposed study is to identify the molecular networks underlying resilience to AD, other age-associated neuropathologies and risk factors associated with resilience.
- Bin Zhang, *Icahn Institute at Mount Sinai*: Develop and validate molecular network models underlying cognitive resilience to AD risk.

Systems genetics identifies modifiers of AD risk and resilience

Catherine C. Kaczorowski

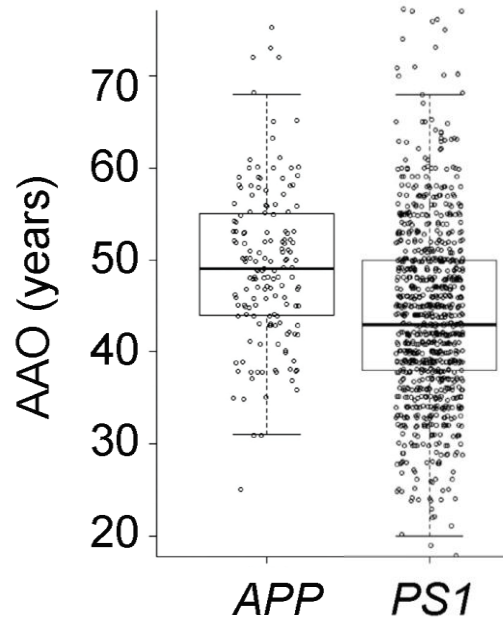
Associate Professor and Evnin Family Endowed
Chair in Alzheimer's Research



Sarah Neuner

Individual differences in the age at first symptom onset (AAO) implicates modifiers

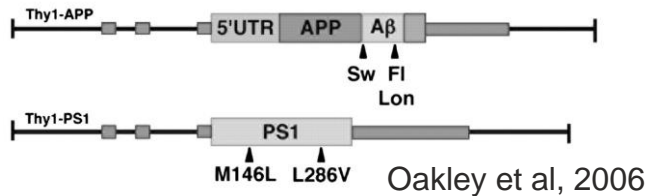
Human FAD
Age at Symptom Onset by Mutation



- Variation not explained by sex
- *APOE* genotype explains ~2-3 yrs
- Protective factors exist in humans that delay onset of FAD
- Asymptomatic AD/resilience difficult to study in human populations

Development of AD-BXD panel to model individual differences in disease susceptibility

5XFAD transgene



AD-BXD Schematic

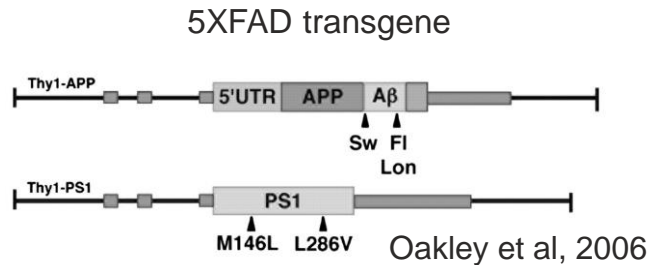
AD model



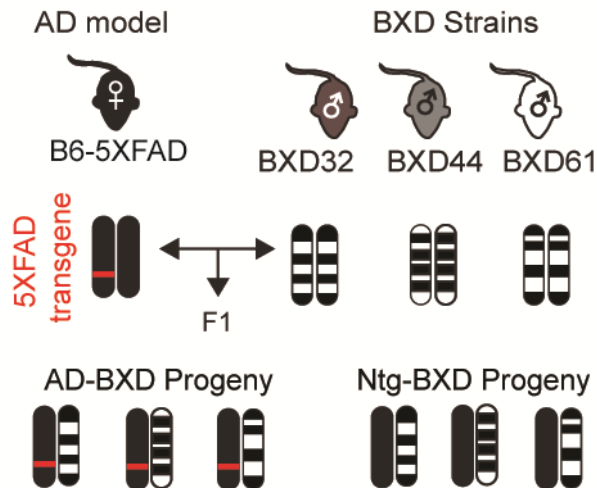
B6-5XFAD

- Combine two well-established mouse resources:
 - 5XFAD mouse model of AD

Development of AD-BXD panel to model individual differences in disease susceptibility

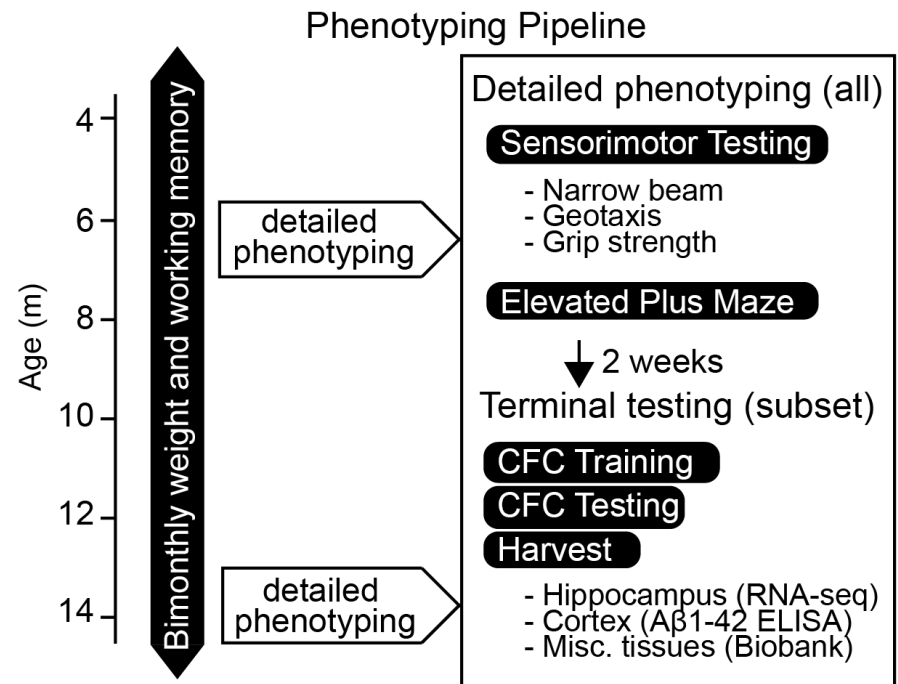
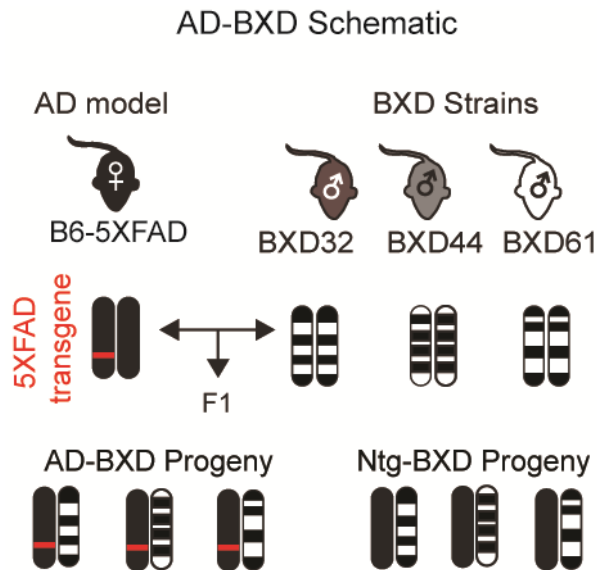
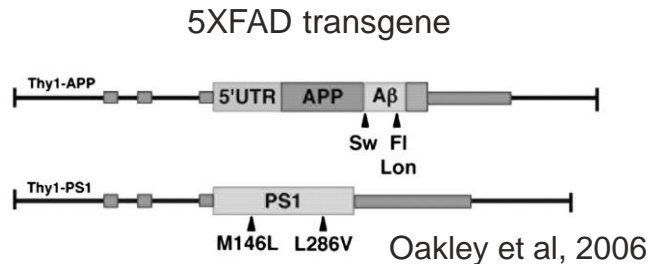


AD-BXD Schematic

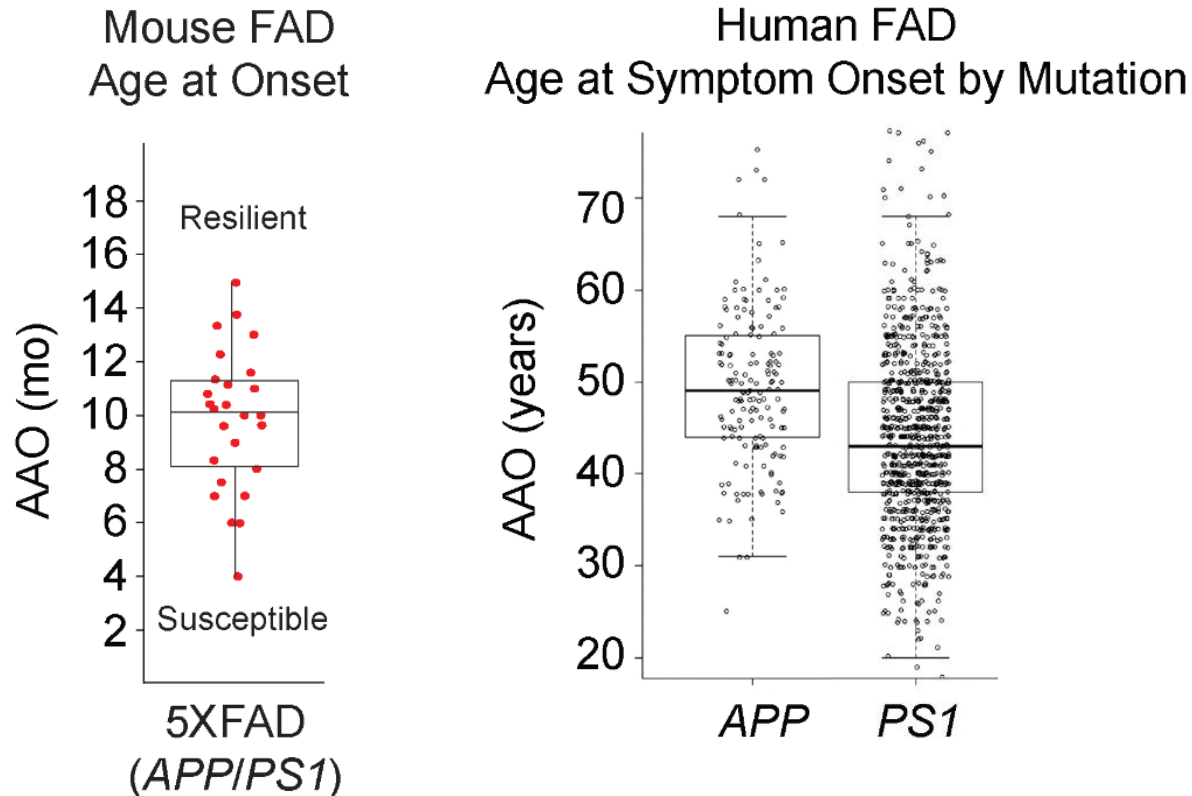


- Combine two well-established mouse resources:
 - 5XFAD mouse model of AD
 - BXD genetic reference panel
- Defined 'high-risk' genotypes
- Replicable

Development of AD-BXD panel to model individual differences in disease susceptibility



Variation in age at onset (AAO) in AD-BXD models parallels that observed in human FAD population



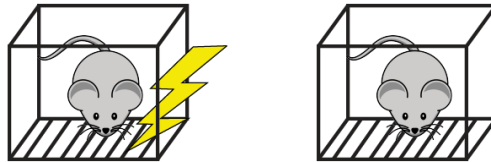
5XFAD on **C57BL/6J** is highly resilient (AAO = +15 mo)

Is the AD-BXD panel sensitive to genetic variants in *ApoE*?

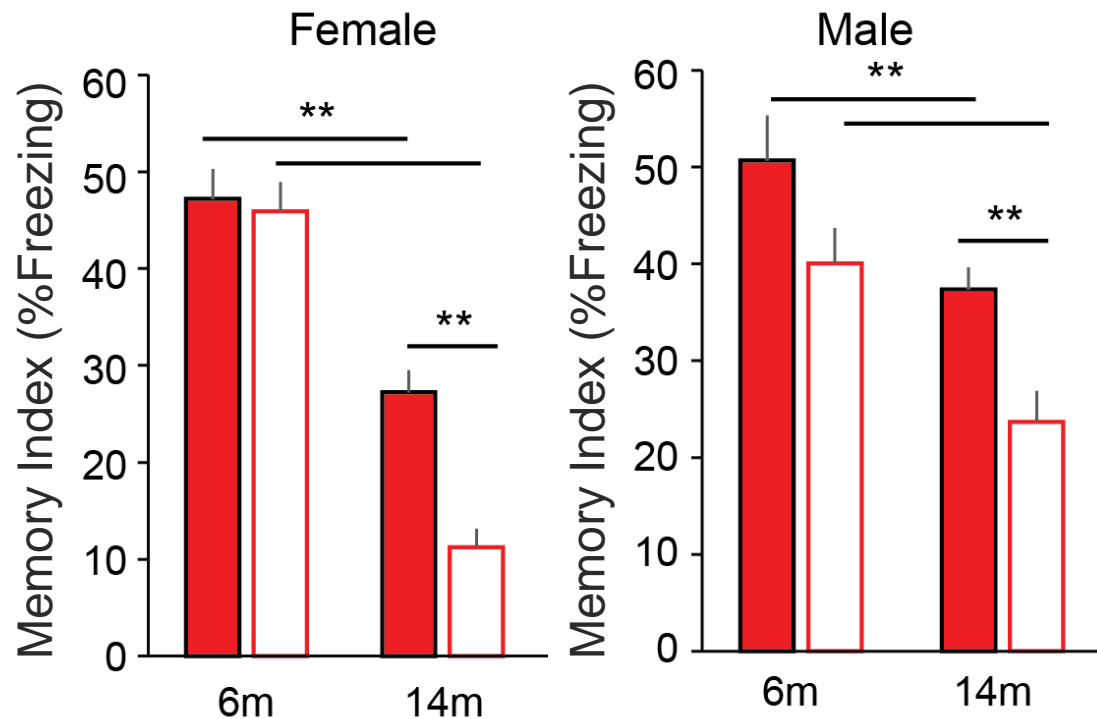
- Receptor-binding region amino acids critical for function
- Single missense polymorphism segregates *B* and *D* *ApoE* alleles
- Missense SNP causes D allele to most closely match human APOE ϵ 4 (RDR)

human position	130	171	176
<i>ApoE</i> ϵ 2	RLGADMEDVCGRLVQYRGEVQAMLGQSTEELRVRLASHLRKLRKRLLRDADDLQKCLAVY		
<i>ApoE</i> ϵ 3	RLGADMEDVCGRLVQYRGEVQAMLGQSTEELRVRLASHLRKLRKRLLRDADDLQKRLAVY		
<i>ApoE</i> ϵ 4	RLGADMEDVRGRLVQYRGEVQAMLGQSTEELRVRLASHLRKLRKRLLRDADDLQKRLAVY		
<i>ApoE</i> B6	RLGADMEDLRNRLGQYRNEVHTMLGQSTEEIRARLSTHLRKMRKRLMRDAEDLQKRLAVY		
<i>ApoE</i> D2	RLGADMEDLRNRLGQYRNEVHTMLGQSTEEIRARLSTHLRKMRKRLMRDADDLQKRLAVY		
mouse position	122	163	168

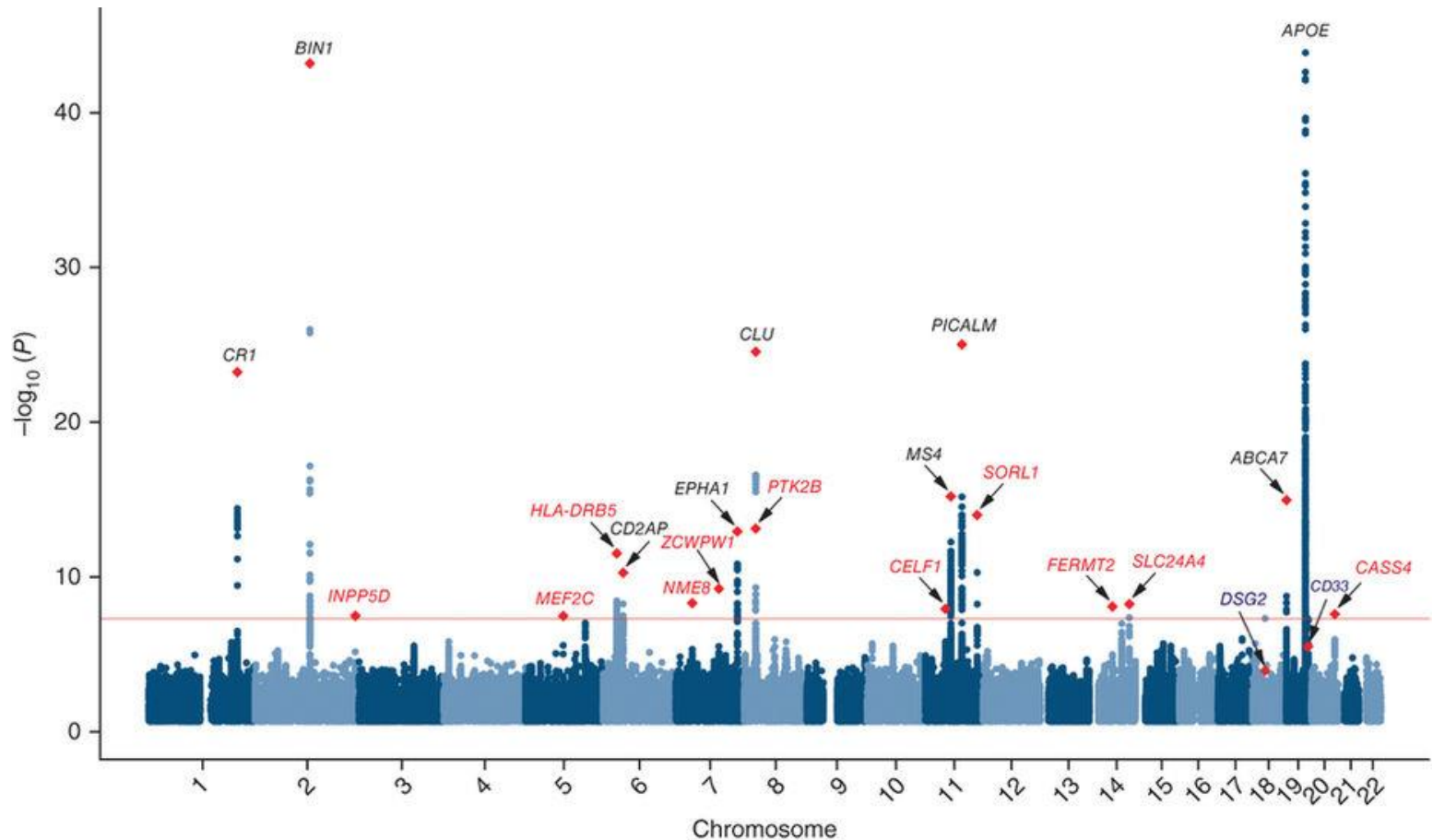
D allele of Apoe represents ϵ 4-equivalent 'susceptibility' allele in AD-BXD_s



Contextual Fear Memory

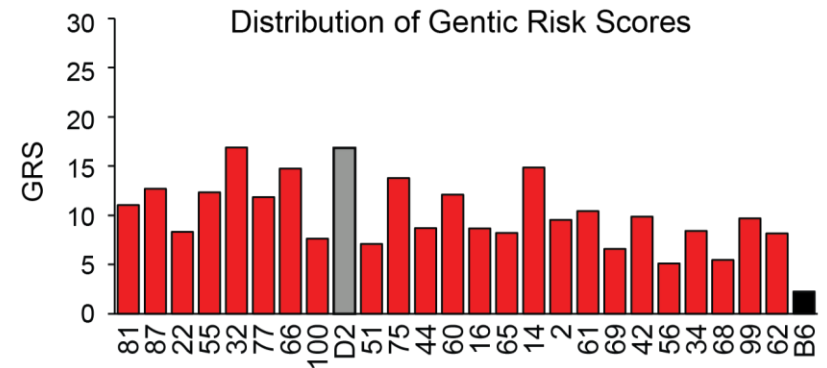
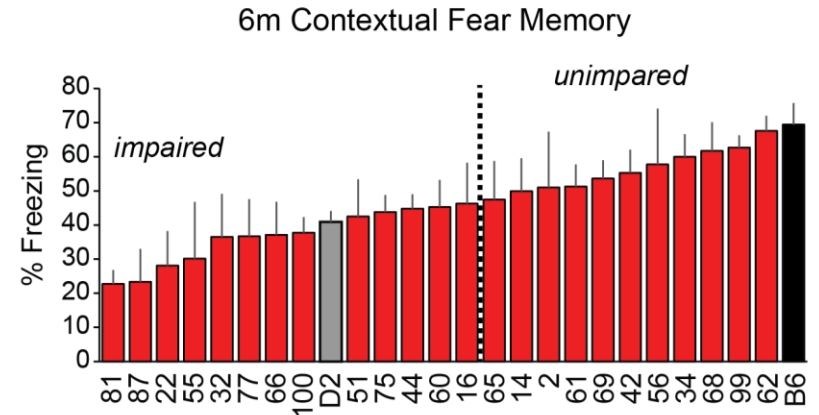


Is the AD-BXD panel is sensitive to variation in multiple AD risk loci?

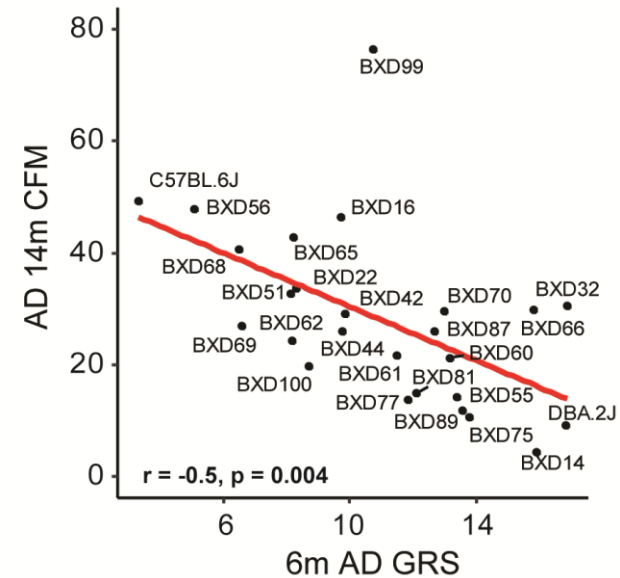
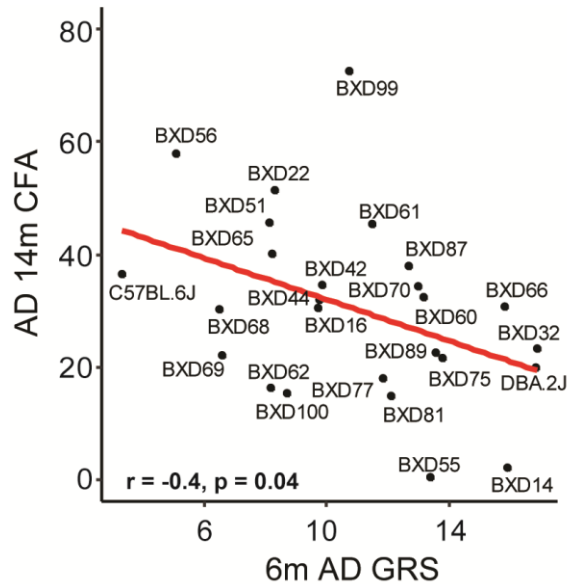
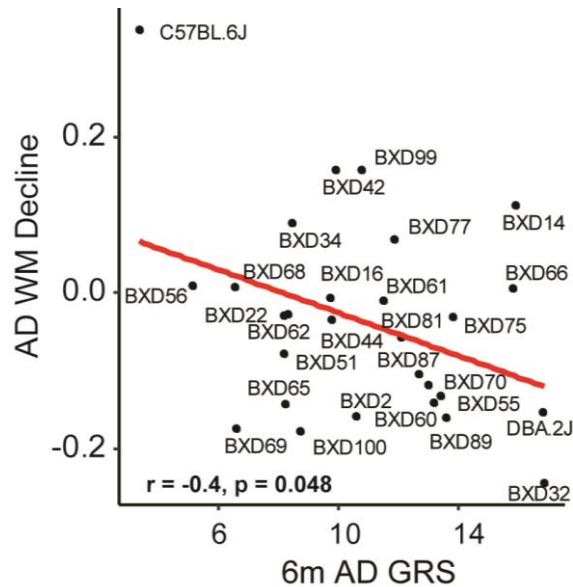


Is the AD-BXD panel is sensitive to variation in other AD risk loci?

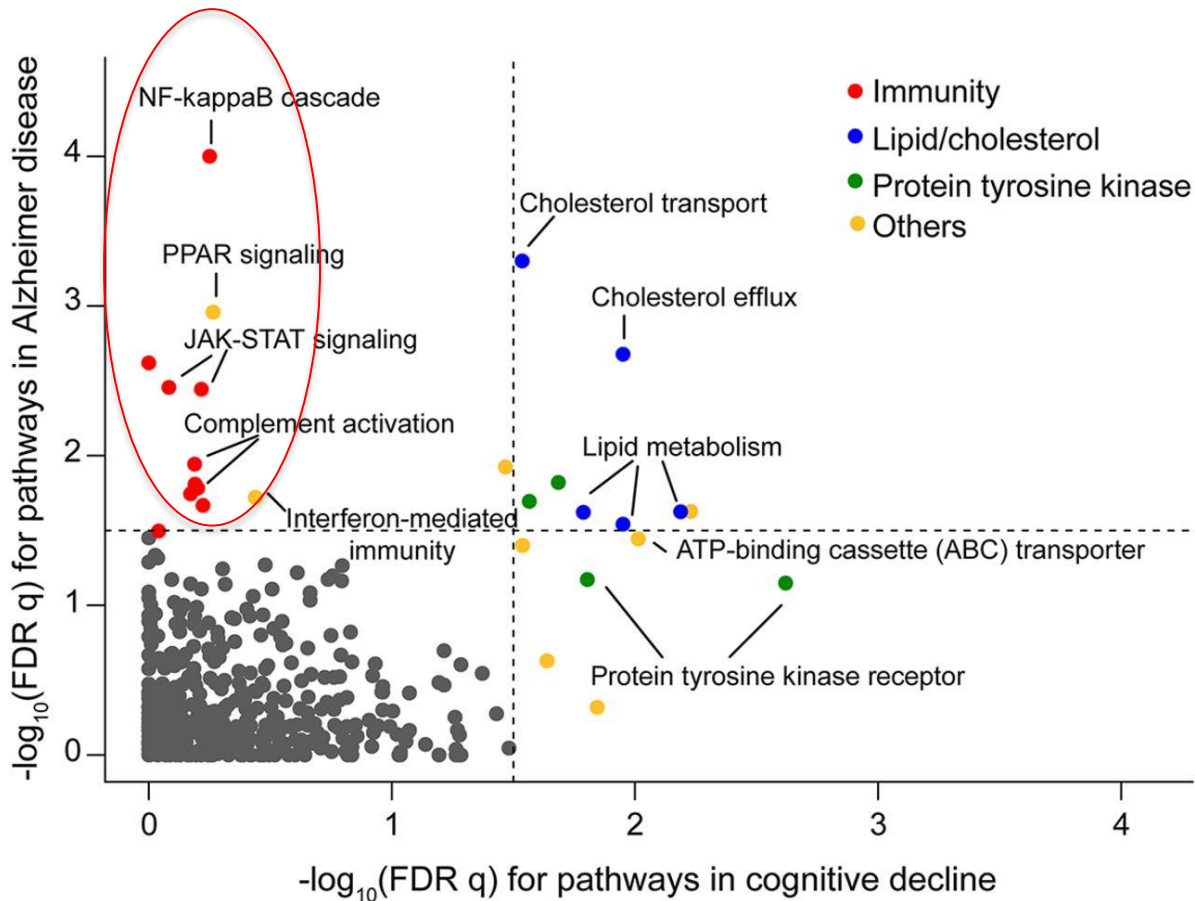
Gene	Mouse Chr.	6m CFM AD				
		Risk allele	Odds ratio	95 % CI	Z stat	Pval
<i>Inpp5d</i>	1	B	1.30	0.28 - 6.3	0.36	0.72
<i>Cr1l</i>	1	D	2.00	0.41 - 9.8	0.85	0.39
<i>Celf1</i>	2	D	1.50	0.30 - 7.4	0.50	0.62
<i>Cass4</i>	2	D	1.50	0.30 - 7.4	0.50	0.62
<i>Zcwpw1</i>	5	D	1.63	0.34 - 8.0	0.61	0.54
<i>Epha1</i>	6	D	1.60	0.33 - 7.8	0.58	0.56
<i>Cd33</i>	7	D	1.67	0.30 - 9.2	0.59	0.56
<i>Picalm</i>	7	D	3.60	0.71 - 18.3	1.55	0.12
<i>Sorl1</i>	9	D	2.50	0.50 - 12.6	1.11	0.27
<i>Abca7</i>	10	D	1.17	0.24 - 5.6	0.19	0.85
<i>Slc24a4</i>	12	D	3.60	0.71 - 18.3	1.55	0.12
<i>Rin3</i>	12	Located within same region as <i>Slc24a4</i>				
<i>Mef2c</i>	13	B	0.86	0.18 - 4.1	0.19	0.85
<i>Nme8</i>	13	D	1.40	0.30 - 6.6	0.42	0.67
<i>Clu</i>	14	D	5.50	0.84 - 36.2	1.77	0.08
<i>Ptk2b</i>	14	Located within same region as <i>Clu</i>				
<i>Fermt2</i>	14	D	1.83	0.32 - 10.6	0.68	0.50
<i>Cd2ap</i>	17	-	1.00	0.21 - 4.7	0.00	1.00
<i>H2-Eb1</i>	17	D	1.05	0.22 - 5.0	0.06	0.95
<i>Trem2</i>	17	B	1.20	0.25 - 5.8	0.23	0.82
<i>Bin1</i>	18	D	1.33	0.28 - 6.3	0.36	0.72



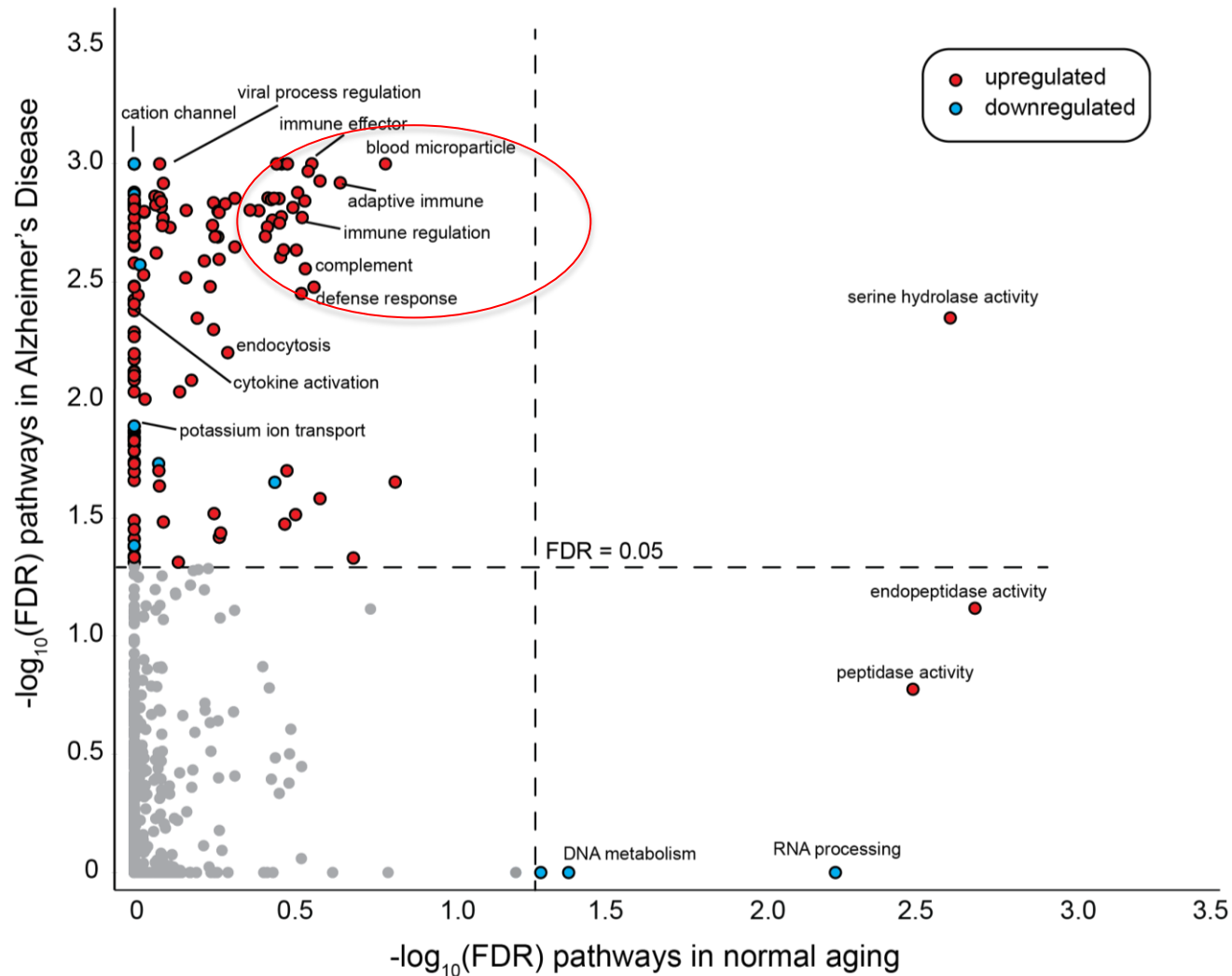
AD-BXD panel is sensitive to variation in known AD risk loci



Do pathways enriched in AD genome-wide studies overlap with pathways enriched in AD-BXDs?

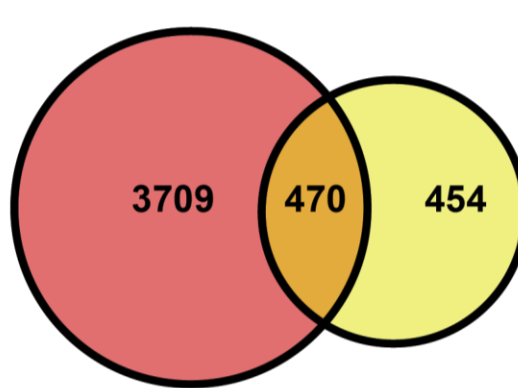


Pathway enrichment analysis of normal cognitive aging and AD highlights immune mechanisms in AD-BXD

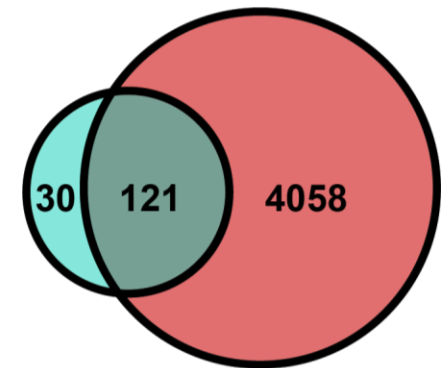


Overlap of genes involved immune enrichment in AD-BXD mice and humans with AD

- Genes upregulated in AD-BXDs
- Zhang et. al. immune *yellow* module
- Jones et. al. AD GWAS genes in ≥ 2 modules



$J = 0.10$
 $p = 0.002$



$J = 0.03$
 $p = 0.002$



GeneWeaver.org
A system for the integration of functional genomics experiments.

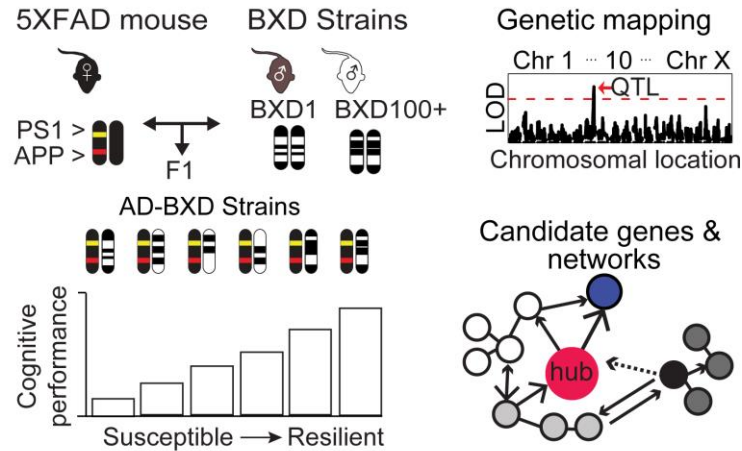
Home Search Manage GeneSets Analyze GeneSets About Help

Search for GeneSets

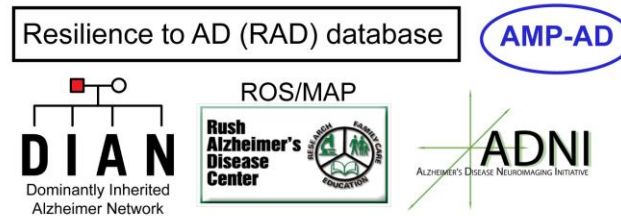
- **AD-BXD panel represents new model for human AD**
 - Variation in AAO mirrors that in human populations
 - Our panel displays sensitivity to known AD risk loci
 - High concordance in expression of AMP-AD Targets between mouse AD-BXD panel and human cohorts (not shown)
- **Approach identified two critical reasons why mouse models may have historically failed for AD:**
 - Lack of genetic diversity
 - Poorly aligned preclinical assays
- **Goal: Identify gene networks and novel drivers of resilience to AD (i.e. potential new drug targets)**

New Resilience-based Targets for Disease Prevention: A Mouse-Human-Mouse Discovery Pipeline

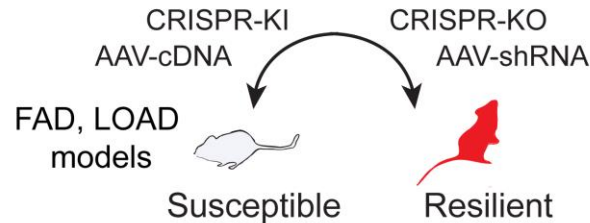
Aim 1: Define resilient genetic and molecular signatures



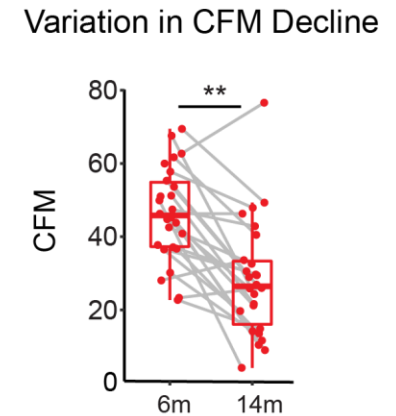
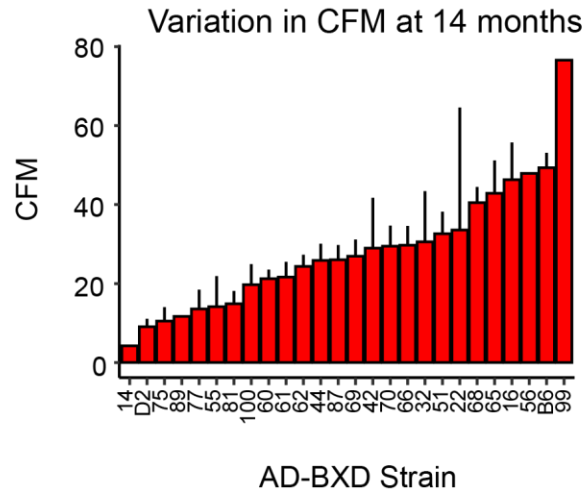
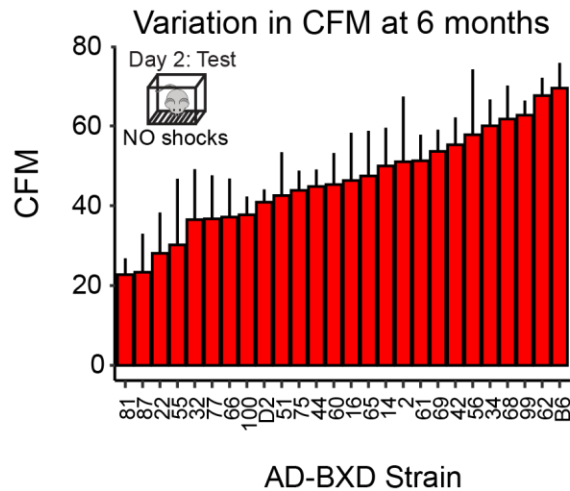
Aim 2: Prioritize based on human relevance



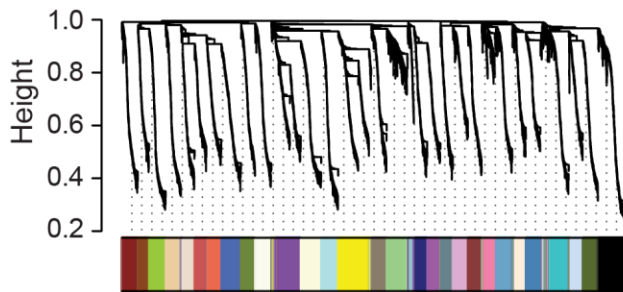
Aim 3: Validate new and *a priori* candidates in AD models



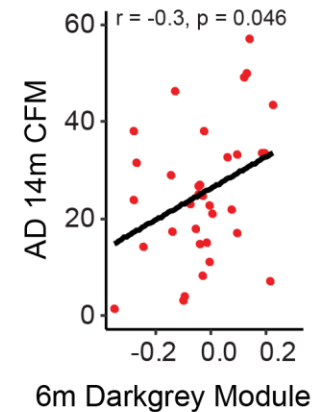
Networks of co-expressed genes at pre-symptomatic time points can predict late-disease cognitive resilience



Identify of groups of co-expressed genes (modules) in 6 month-old AD-BXDs



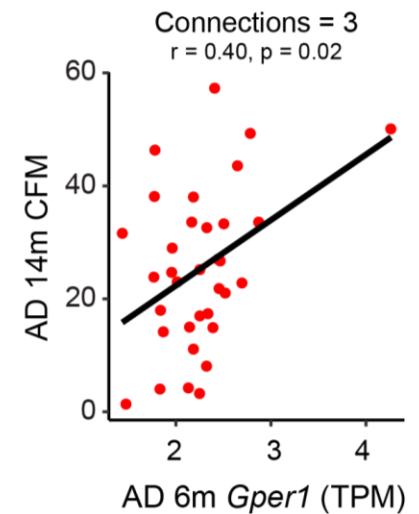
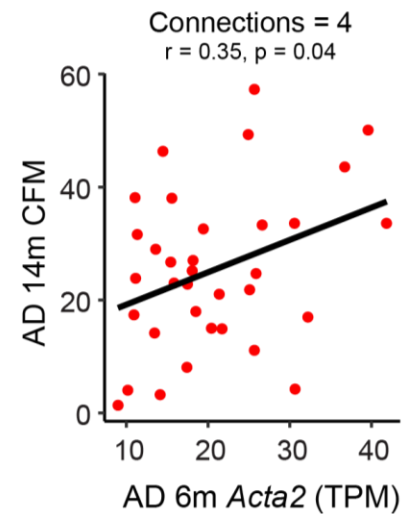
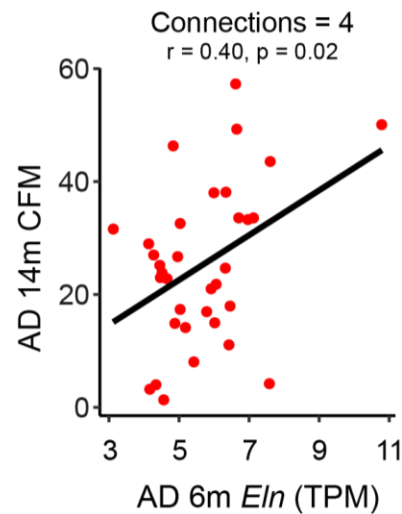
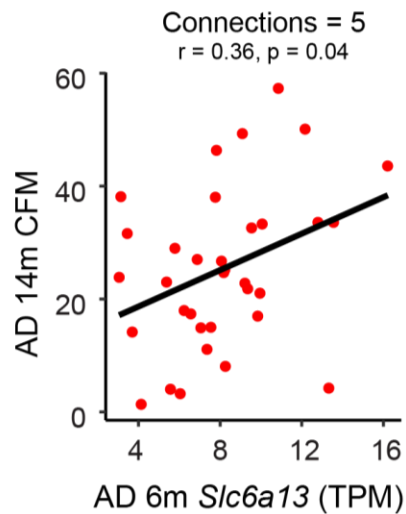
Relate 6 month-old (presymptomatic) modules to 14 month-old (symptomatic) cognitive function



Candidate gene prioritization highlights putative resilience factors

Prioritize candidate genes by:

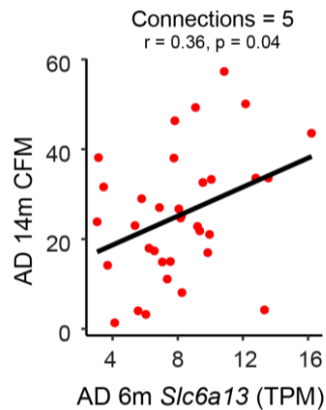
1. Correlation with late-disease cognitive status
2. Hub gene status as measured by number of direct connections after partial correlation



Slc6a13 as putative resilience factor and blood biomarker

Prioritize candidate genes by:

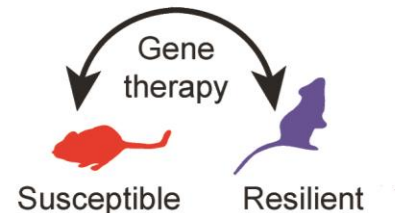
1. Correlation with late-disease cognitive status
2. Hub gene status as measured by number of direct connections after partial correlation



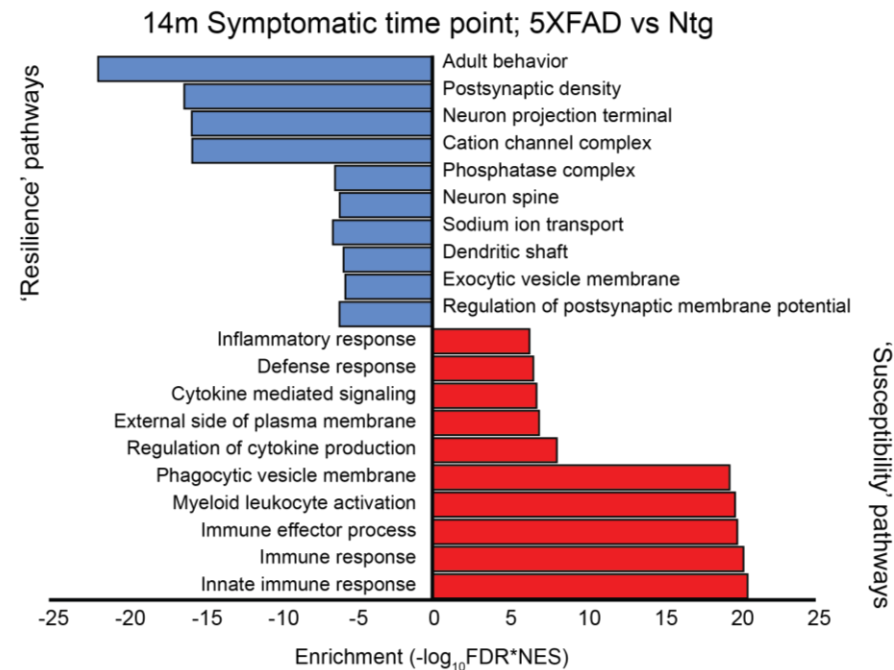
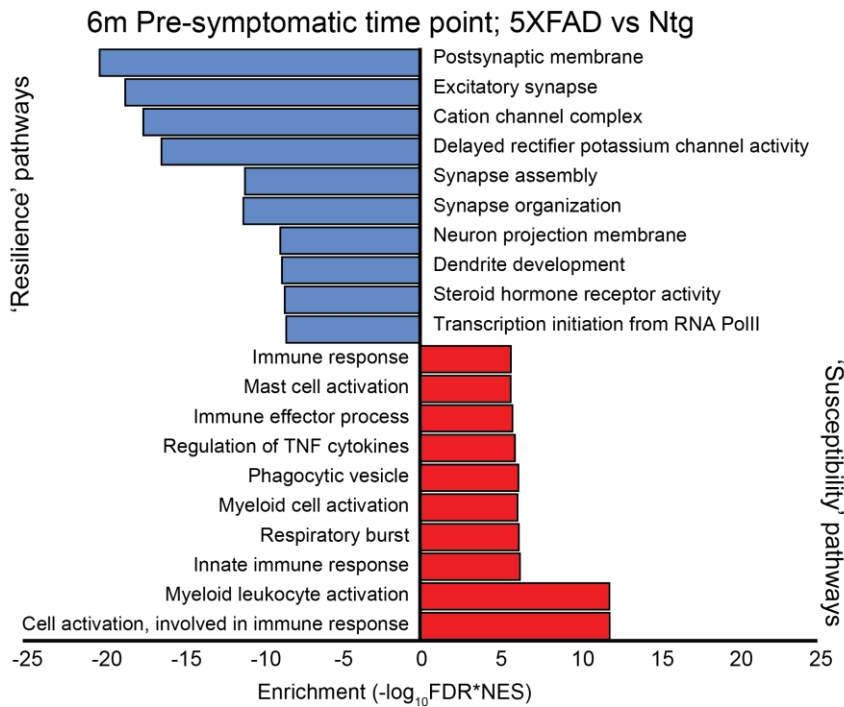
- GABA transporter 2
- Expressed at blood-brain barrier
- AD blood biomarker (Long et. al 2016)
- Expression modified by estrogen levels

Back into the mouse to test causality

Validate in new AD models

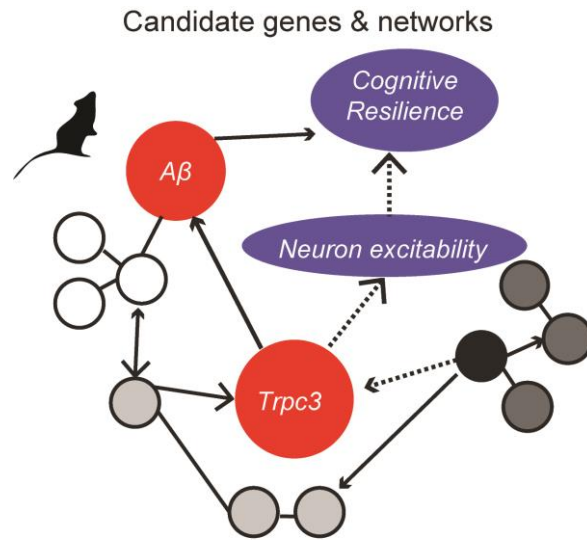


'Resilience' pathways in AD are related to neuron function terms: focus on ion channels and receptors

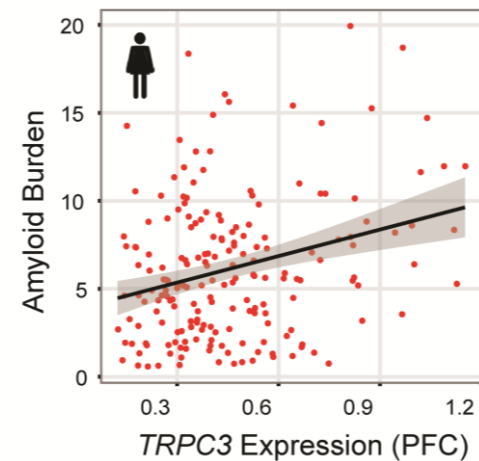


A Mouse-Human-Mouse Discovery Pipeline

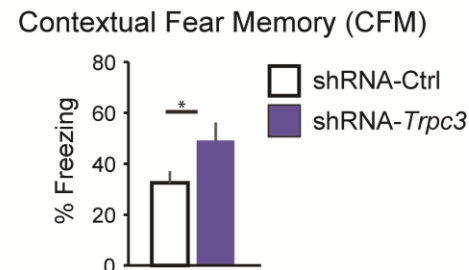
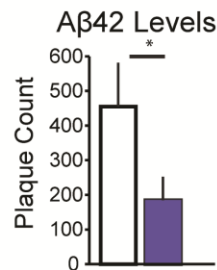
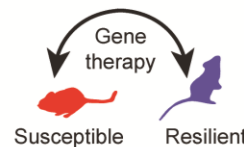
Proof of concept – *Trpc3*



Cross-check against complementary human data (AMP-AD)



Validate in new AD models



Acknowledgements

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AFAR (PI: Wilmott, role: mentor, completed)

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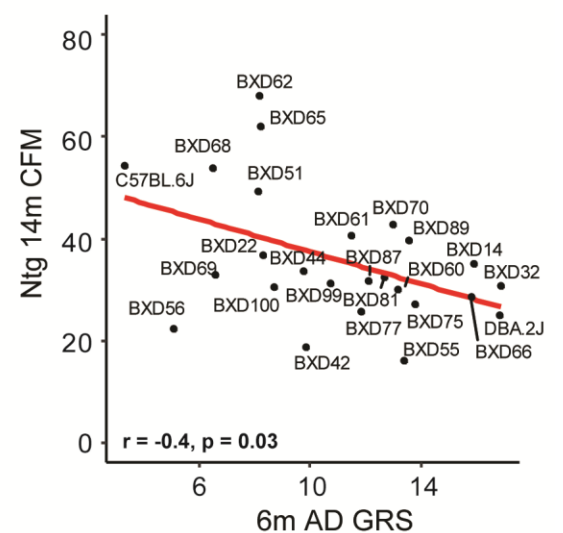
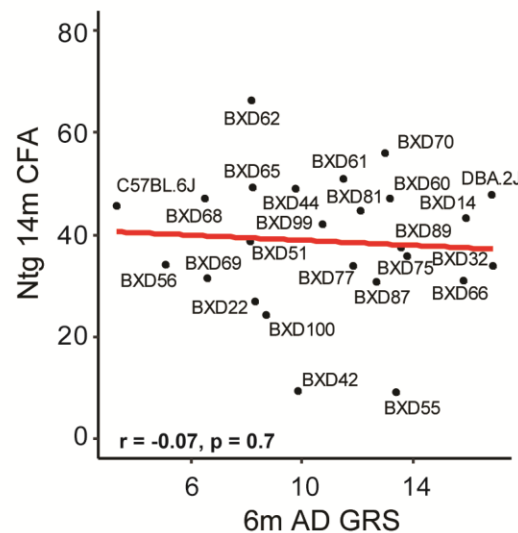
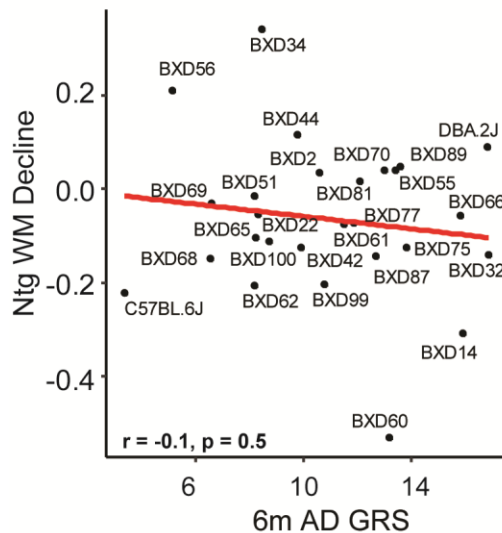
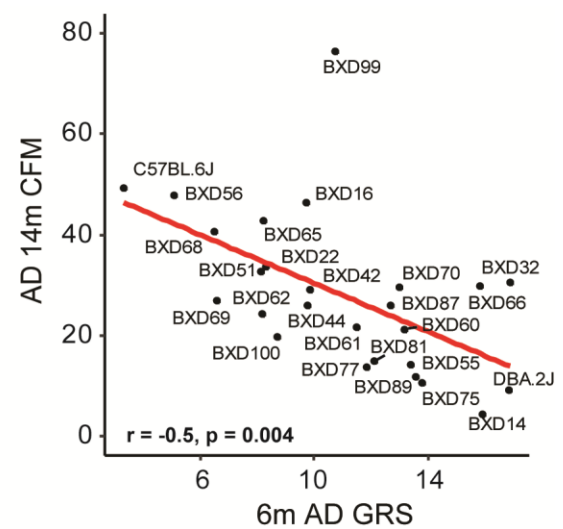
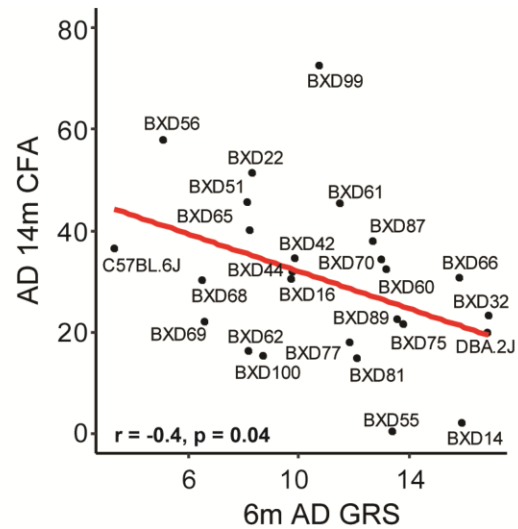
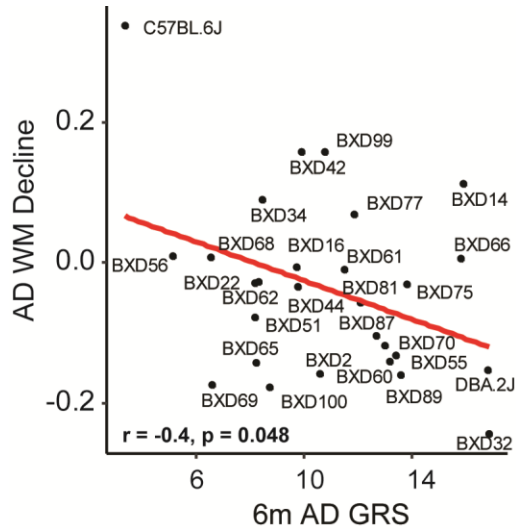
Dorothy Dillon Eweson
Lecture Series on the
Advances in Aging Research



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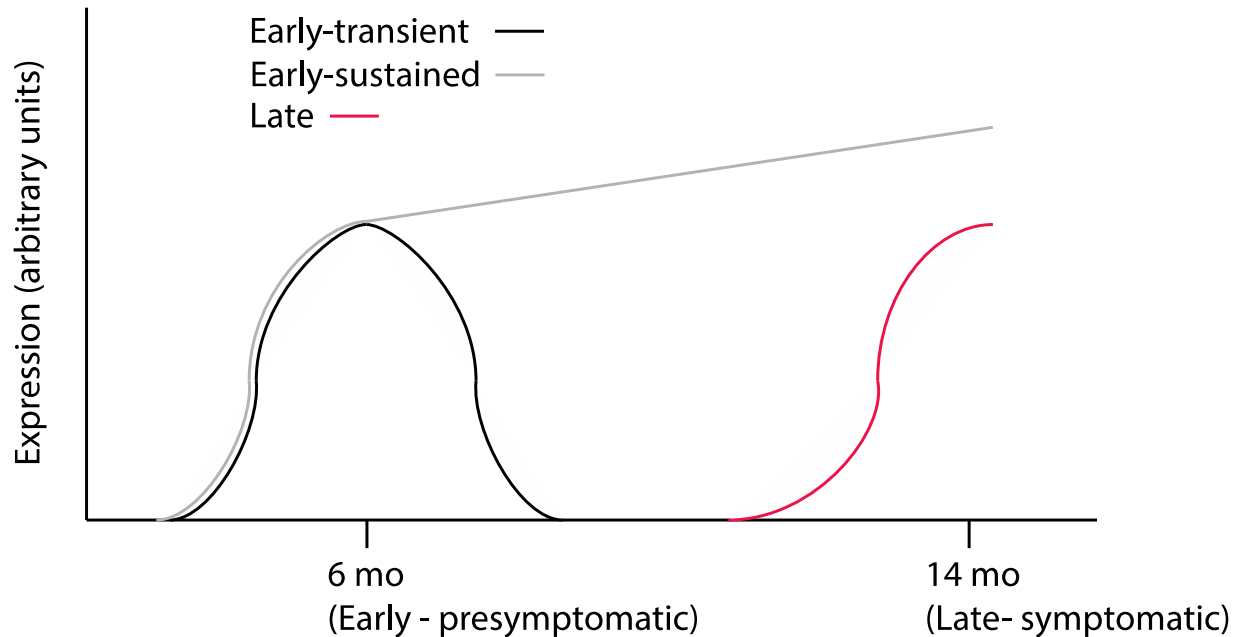
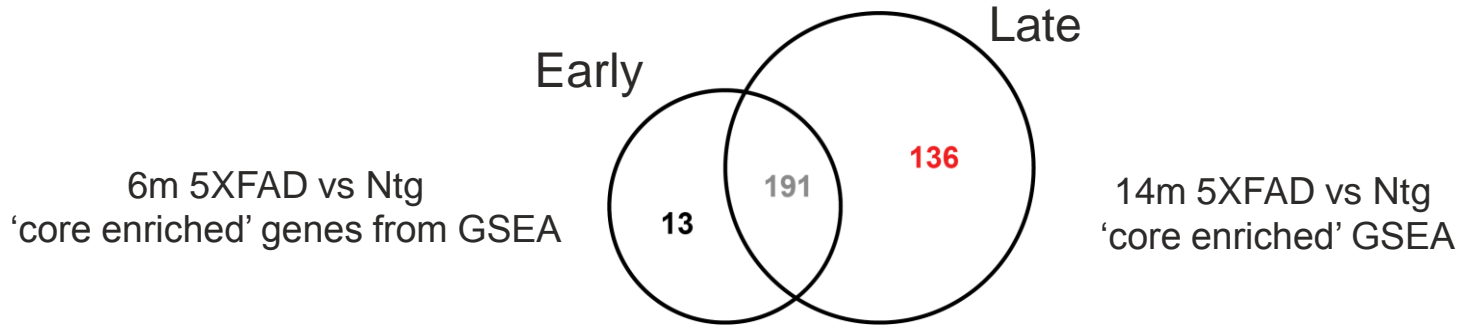


AD-BXD panel is sensitive to variation in known AD risk loci

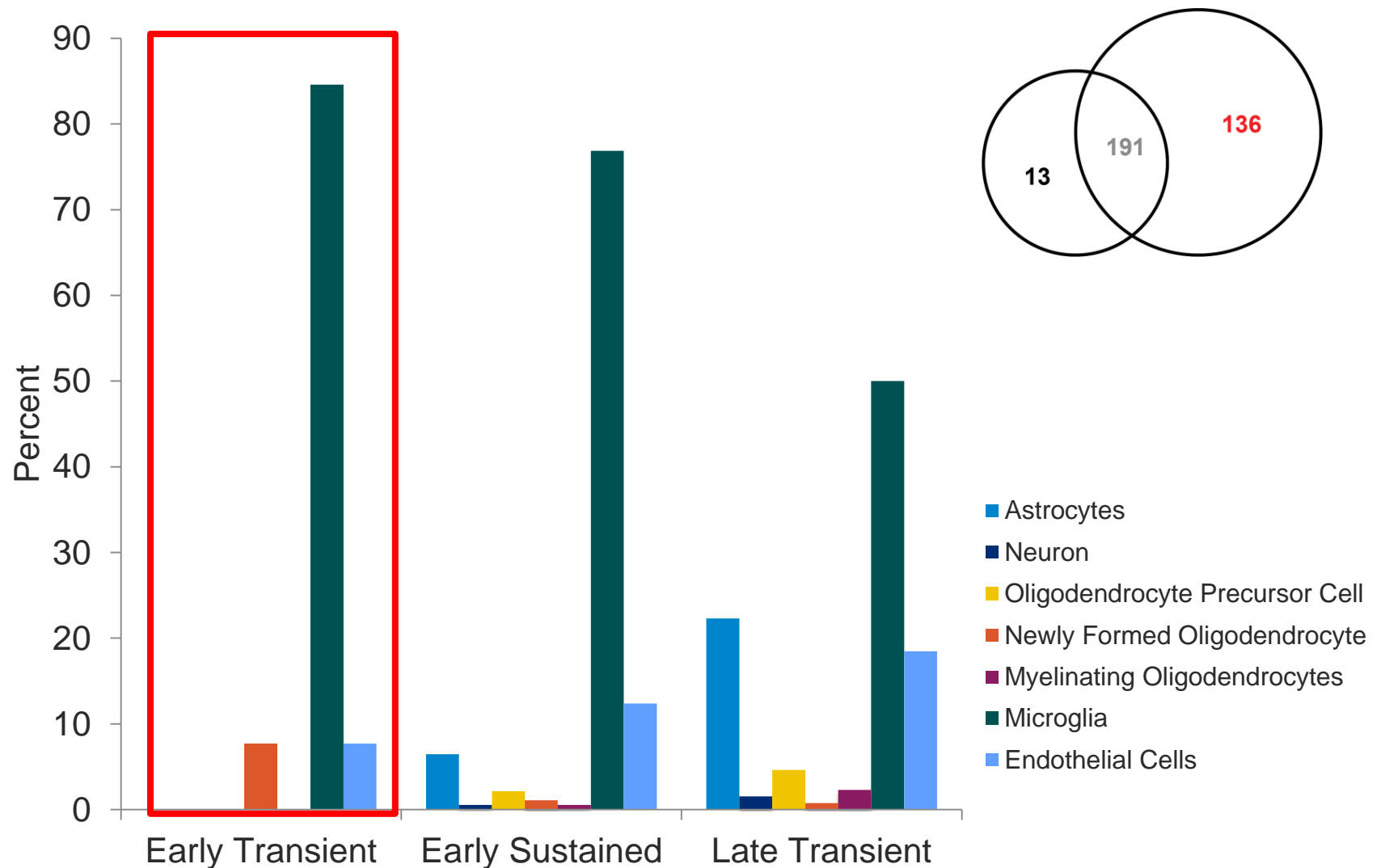


GSEA of DE Genes from AD-BXDs compared to Ntg-BXDs

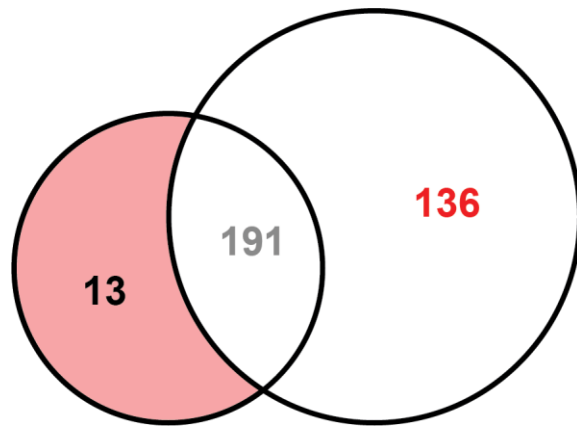
Top Positively Enriched GO Biological Processes



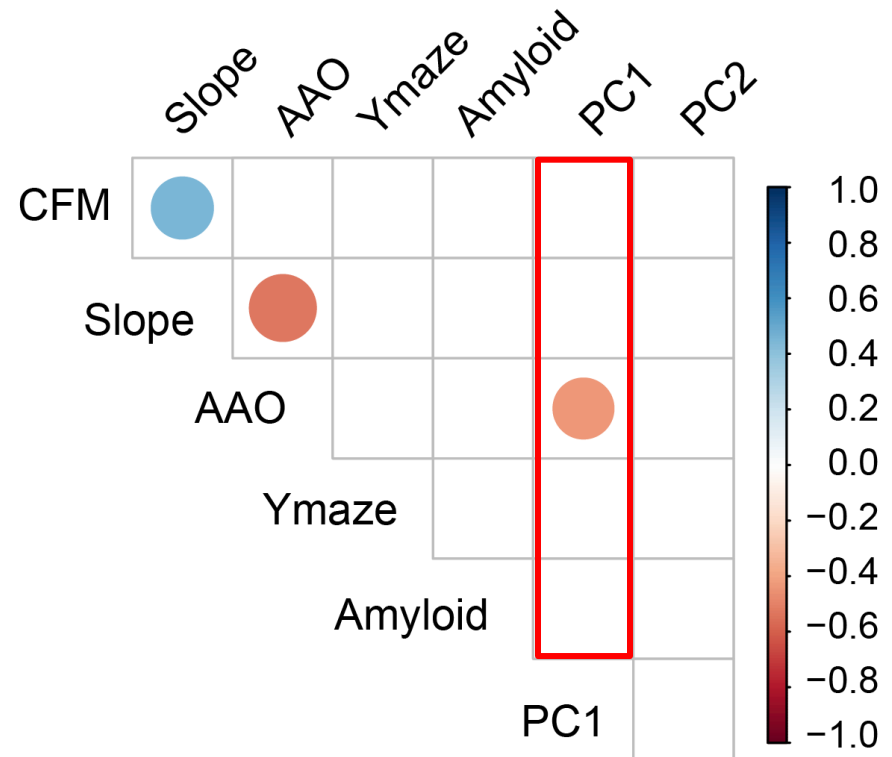
Cell-Type assignment of GSEA “Immune” genes implicate microglia



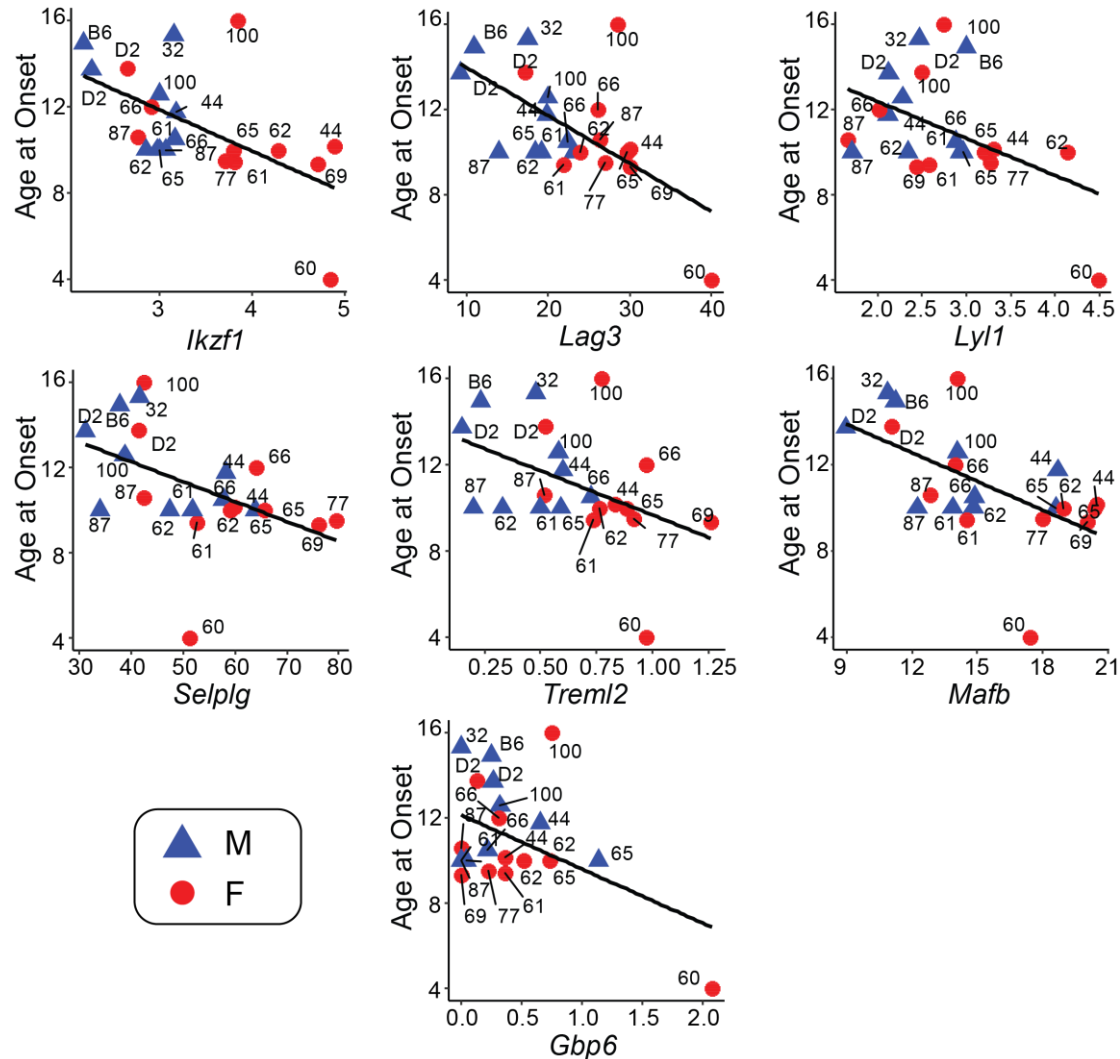
The expression of early-transient genes is correlated with age at onset (AAO), and not amyloid



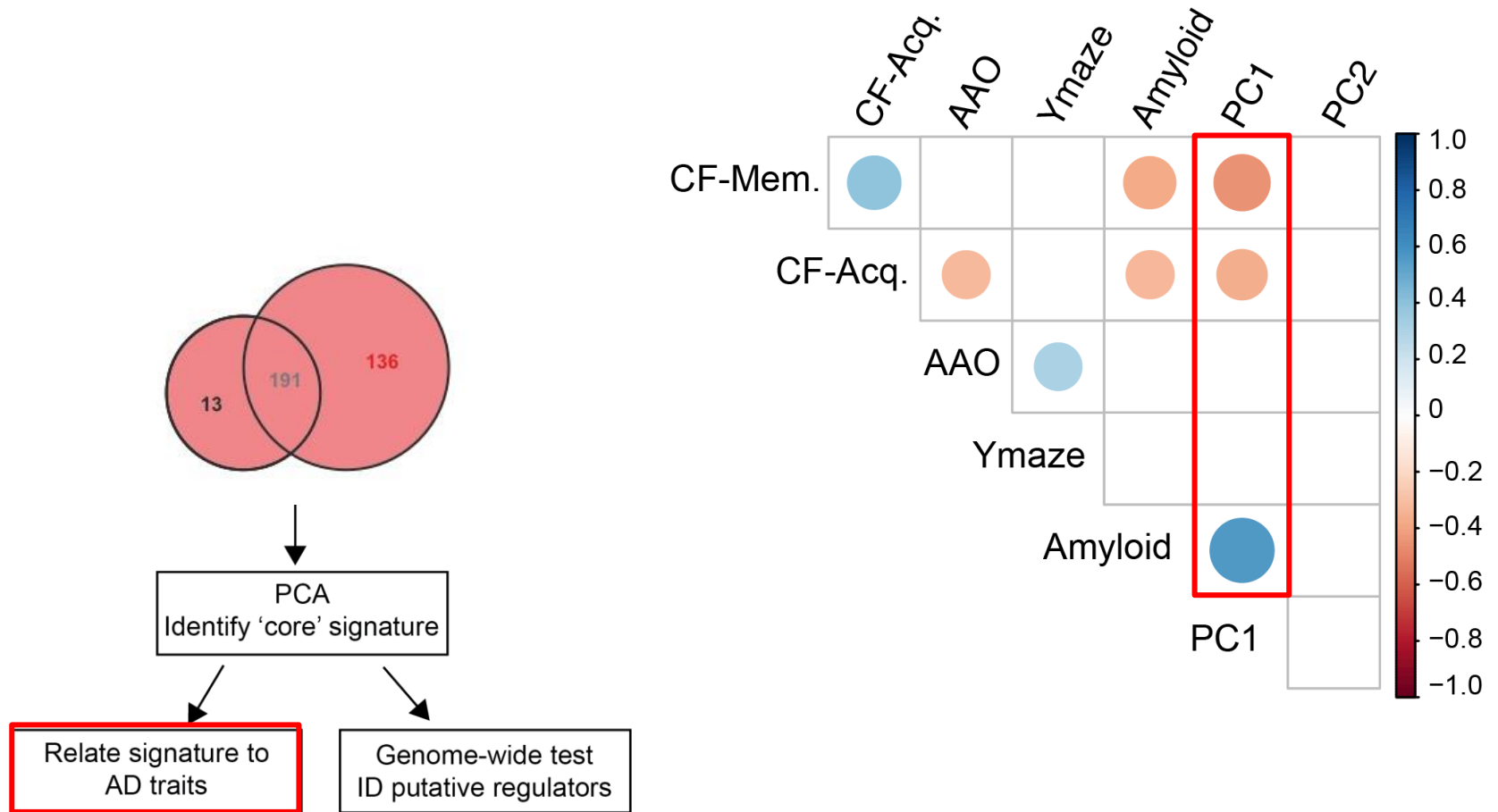
PCA: 13 Early Transient Genes



Higher expression of early-transient genes is related to earlier age at onset (AAO) of cognitive impairment

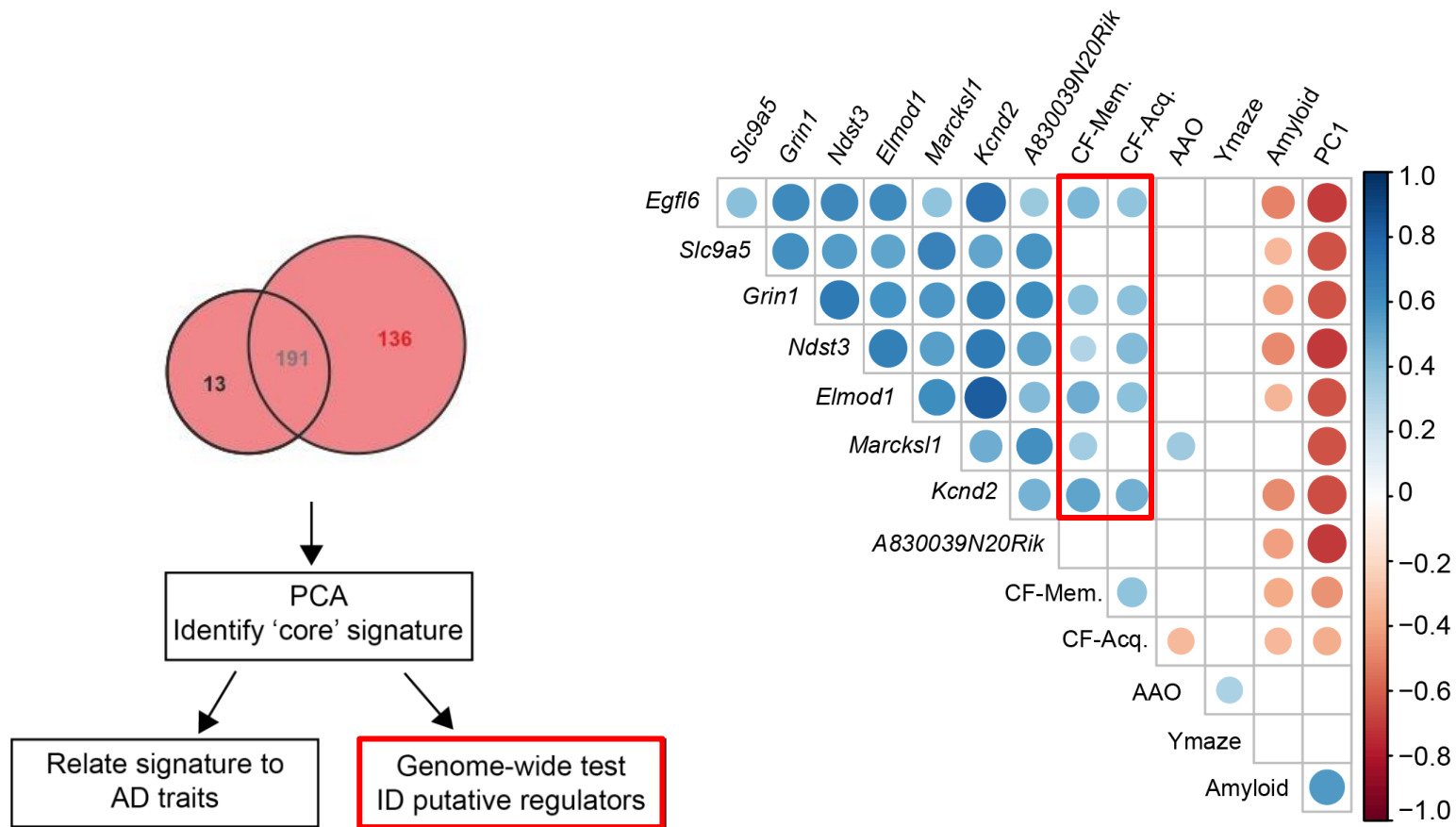


Microglia “core” gene expression (PC1) correlate with performance on short- and long-term memory



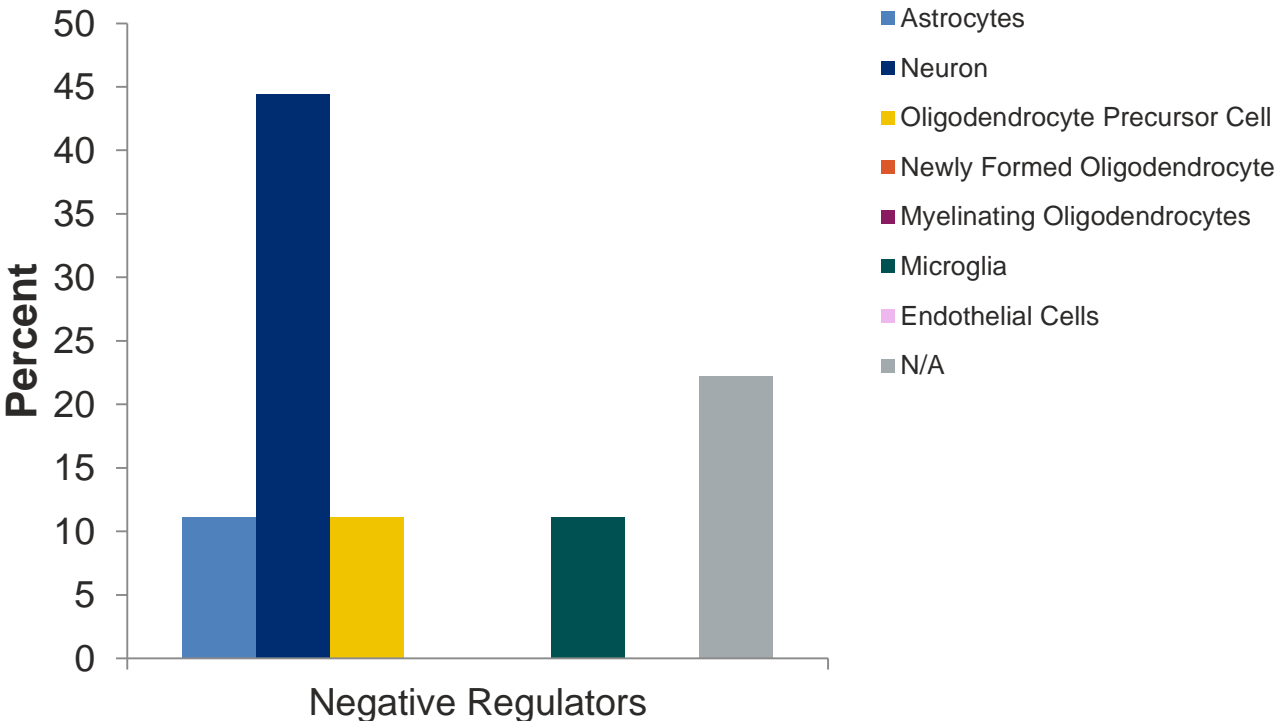
- Higher expression of “core” microglia genes corresponds to poorer performance on CF acquisition and memory
- Higher expression of “core” microglia genes corresponds to higher amyloid levels detected by ELISA assay

Genome-wide search reveals negative regulators of microglia “core” genes (PC1) as drivers of cognitive resilience



- Higher expression of negative regulators of microglia (PC1) corresponds to better CF acquisition and memory
- Higher expression of negative regulators of microglia (PC1) also corresponds to lower amyloid levels by ELISA

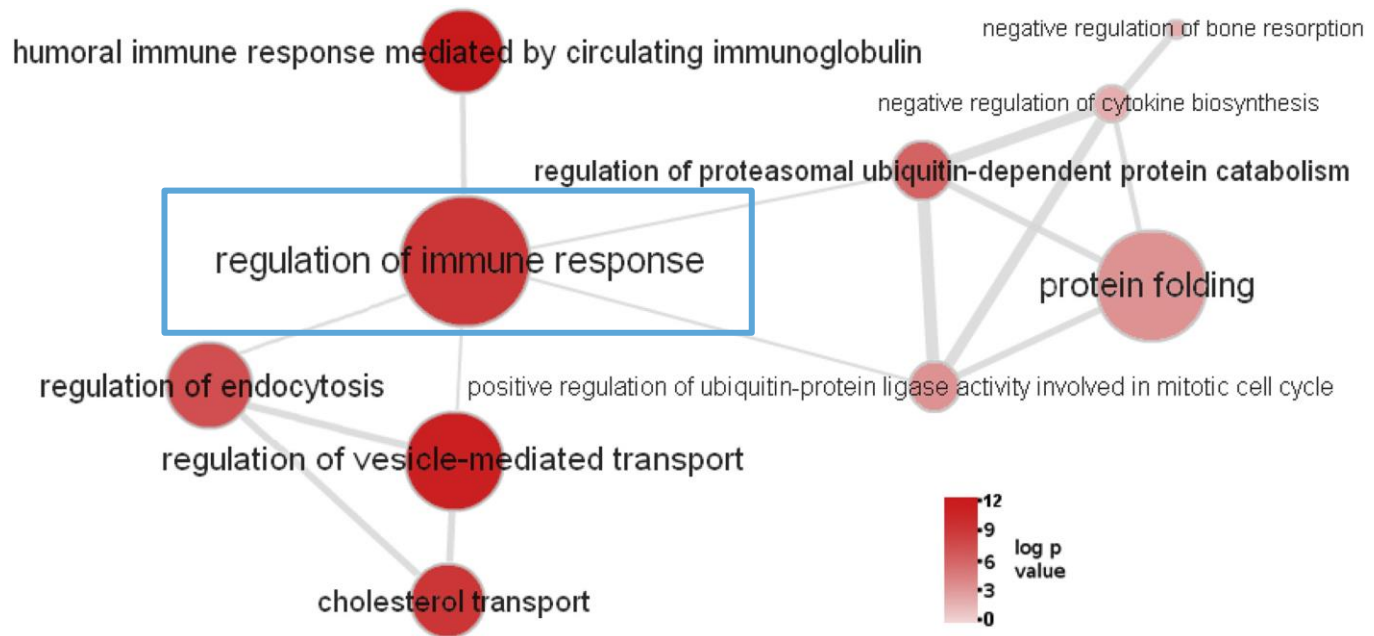
Cell-type specific enrichment of negative regulators suggests neuron involvement



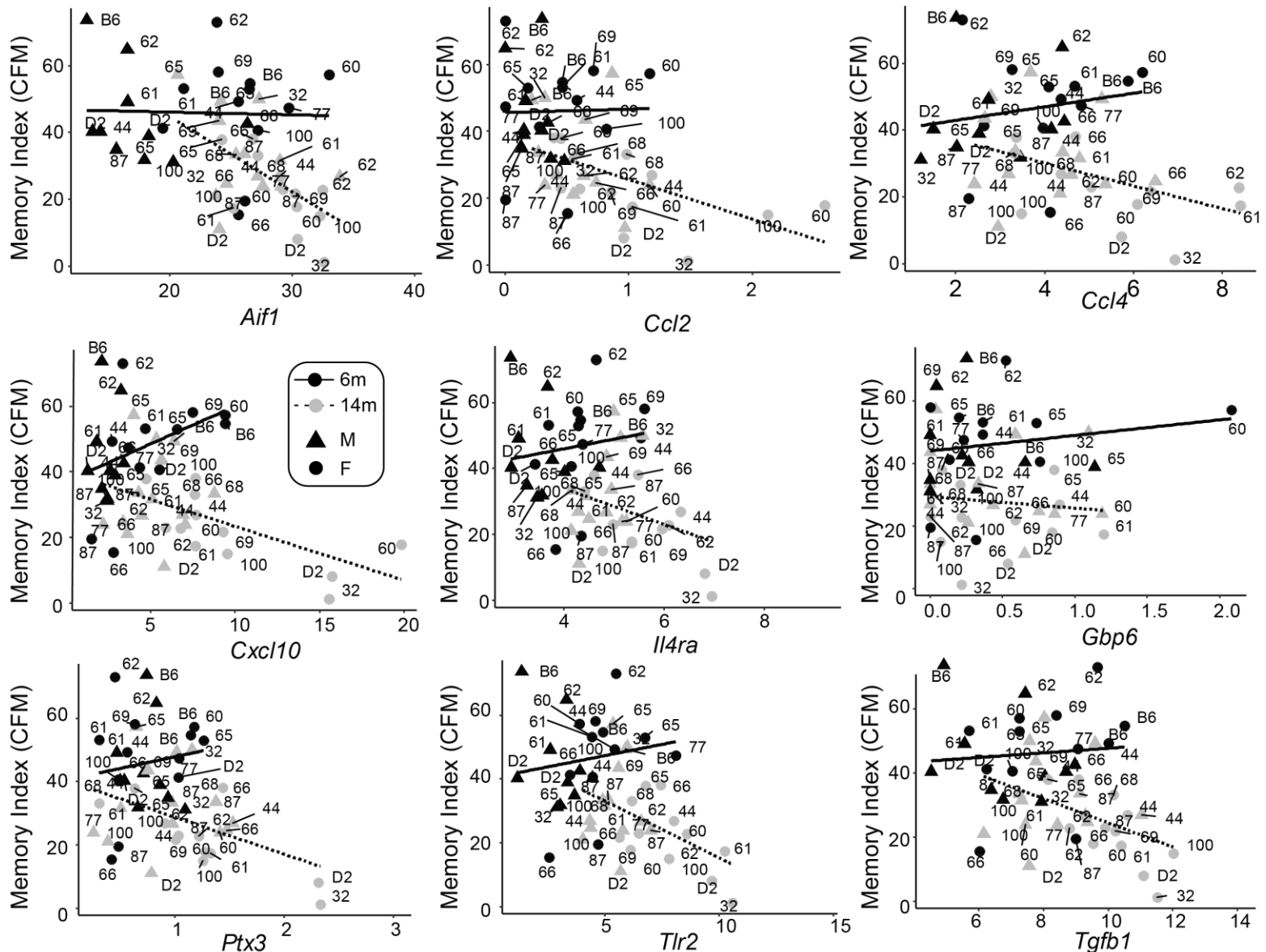
Overall Summary

- Synergy of mouse-to-human discovery will maximize the capabilities of each approach and minimizes the limitations.
 - Complementary to ongoing efforts by MODEL-AD (IU/JAX)
- Because clinical and pathological hallmarks of FAD parallel those of LOAD cases, we expect results from our mouse studies will generalize to LOAD.
- We expect our new AD models will improve predictive validity of preclinical studies and **accelerate discovery** of therapeutics to promote resilience and delay, treat or even cure AD.

Immune response pathways enriched for association with AD SNPs from IGAP

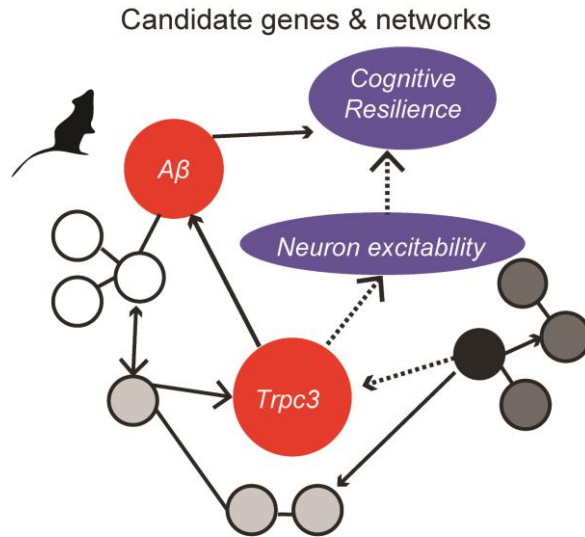


Microglial “core” genes negatively correlate with cognitive deficits in late-stages of the disease (14 mo)

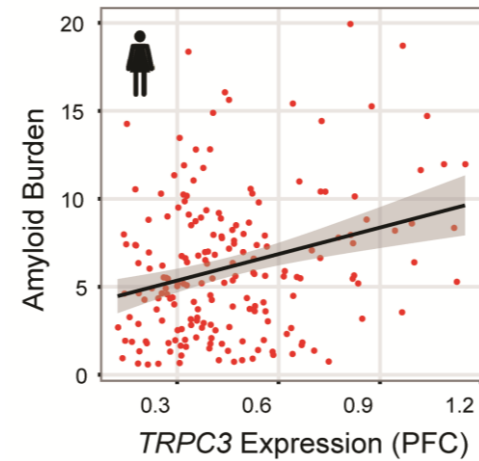


A Mouse-Human-Mouse Discovery Pipeline

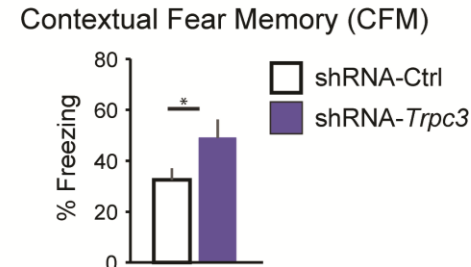
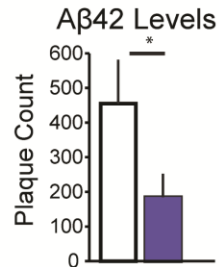
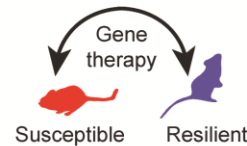
Proof of concept – *Trpc3*



Cross-check against complementary human data (AMP-AD)

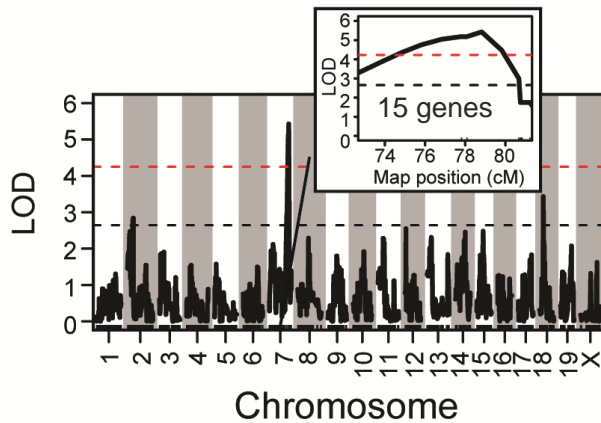
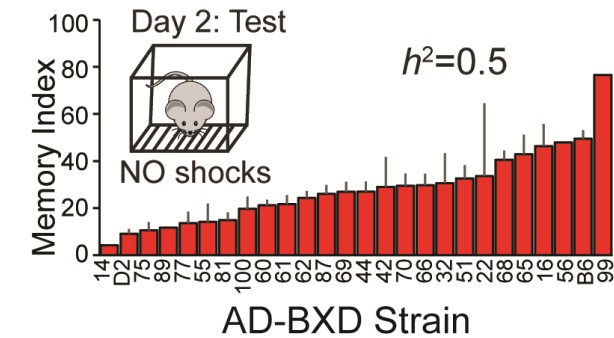


Validate in new AD models

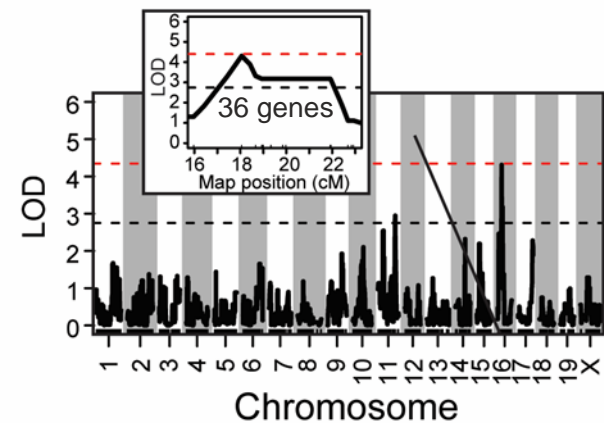
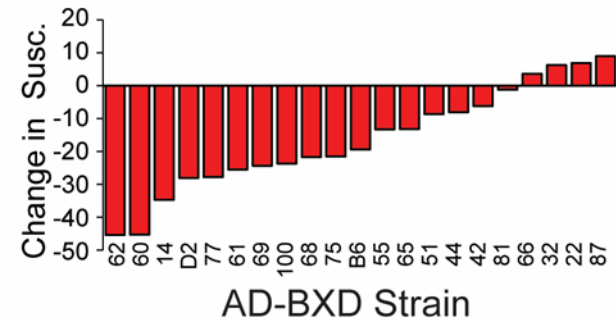


Genetic mapping identifies two *novel* QTLs containing modifiers of cognitive symptoms in AD

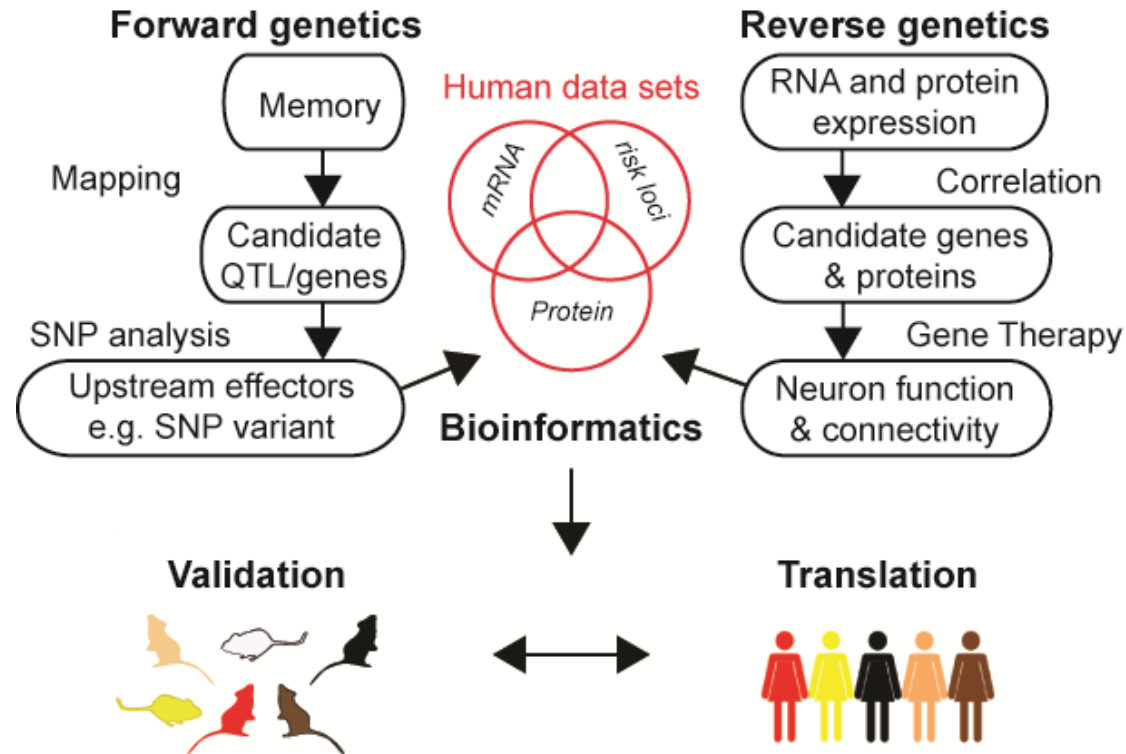
A. Contextual Fear Memory (CFM)



B. Change in 5XFAD Susceptibility (corrected for aging in non-carriers)



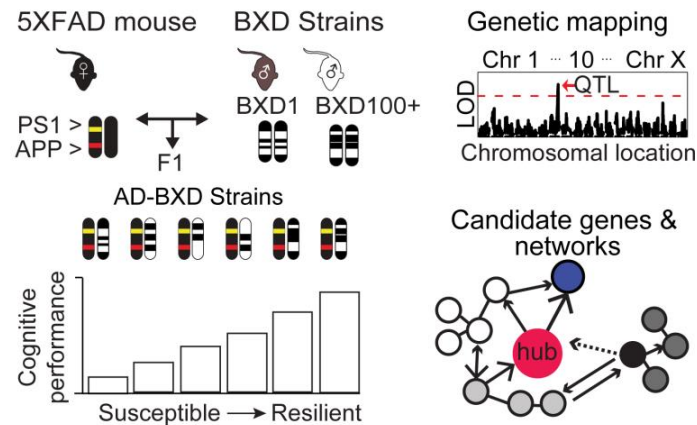
Bridging the gap: “Bench to bedside and back to bench”



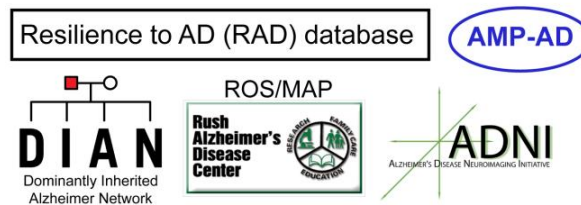
- Understanding the complex biology of resilience to Alzheimer’s disease

Systems genetics analysis of resilience to AD to identify novel drug targets (R01s, 2017-2022)

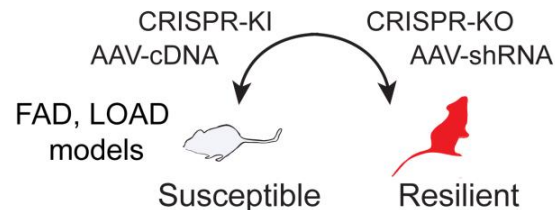
Aim 1: Define resilient genetic and molecular signatures



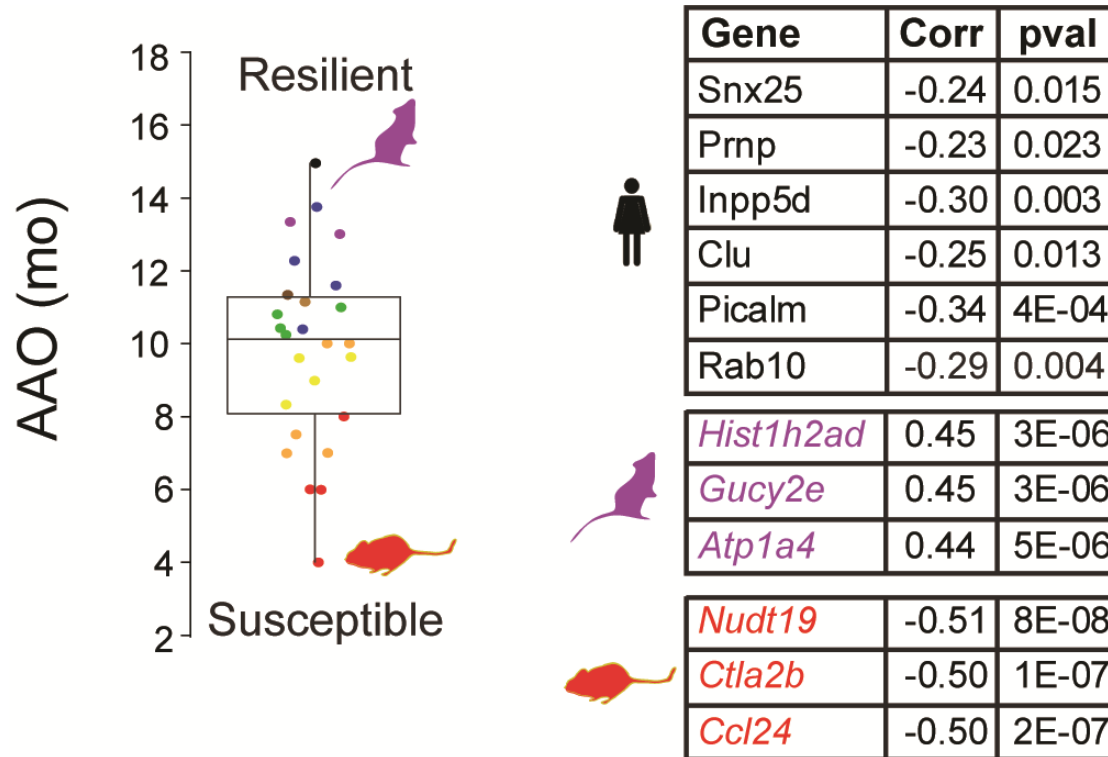
Aim 2: Prioritize based on human relevance



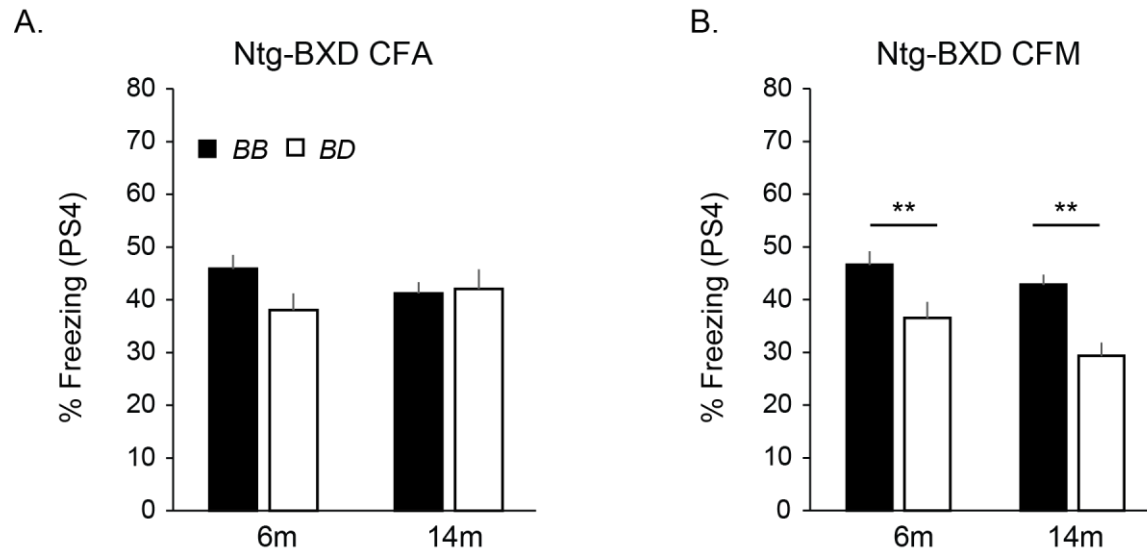
Aim 3: Validate new and *a priori* candidates in AD models



Identification of genetic correlates of age at first symptom onset in the AD-BXD panel

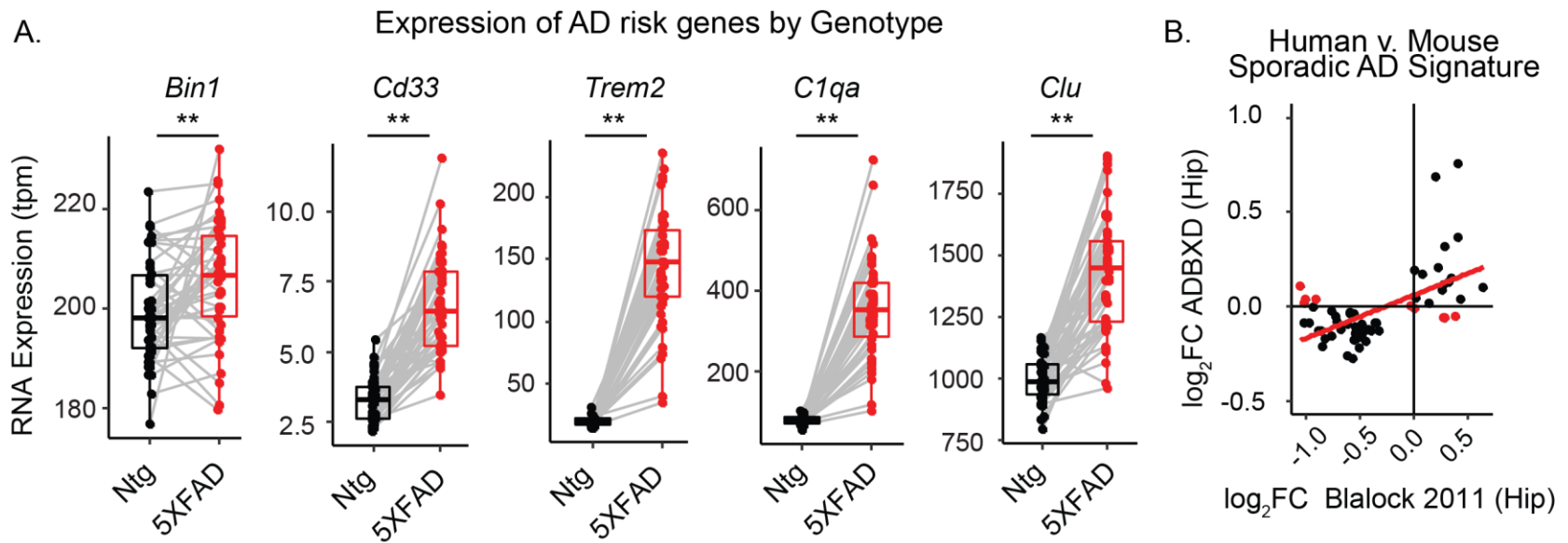


Apoe genotype effects CFM, but not CFA, in Ntg-BXD mice.

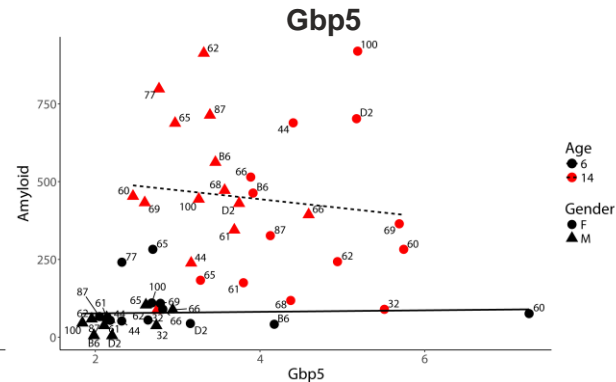
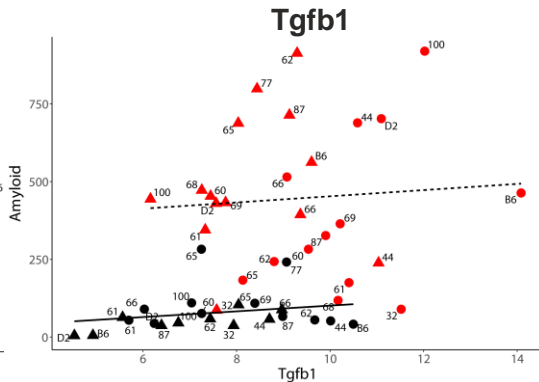
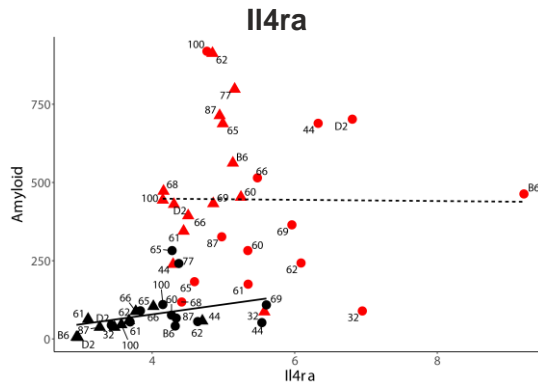
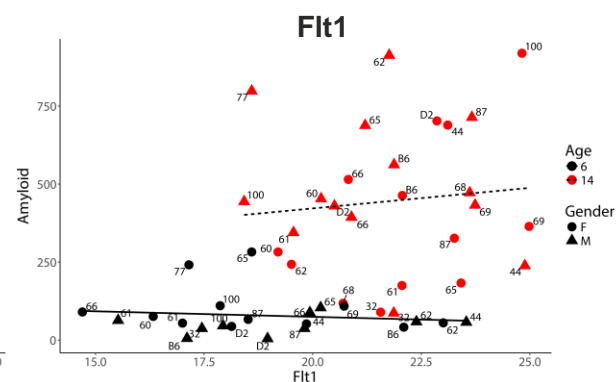
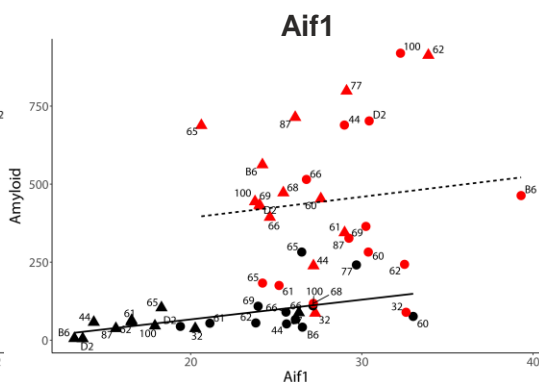
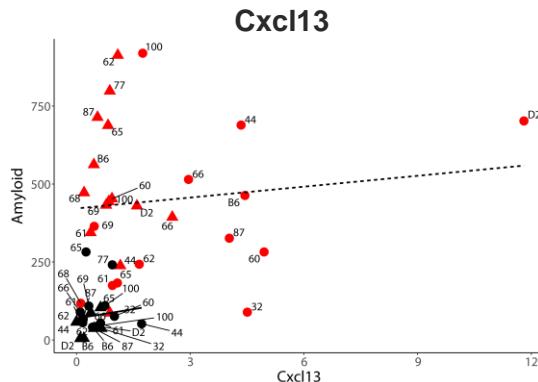
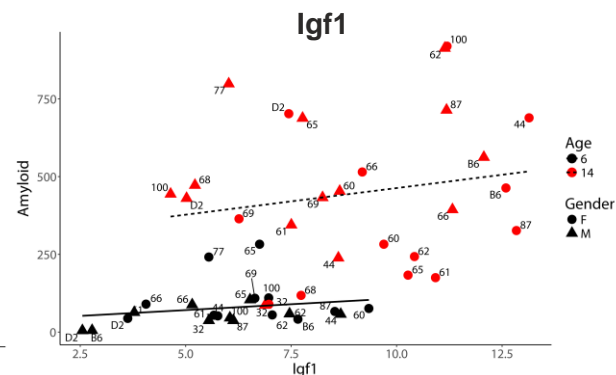
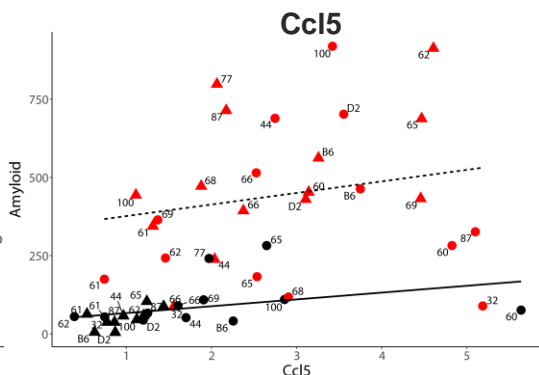
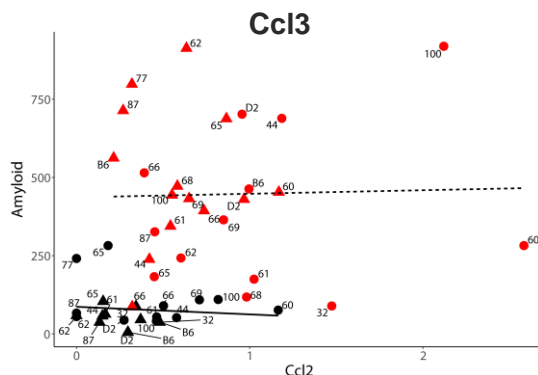


- Introduce D2 variant into B6 background to test hypothesis Apoe allele swap is sufficient to recapitulate cognitive deficits in normal aging and AD

Genetic background modifies AD-associated transcriptome and enhances concordance with human AD signature.

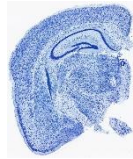


Microglial “core” genes only weakly correlate with amyloid (6 and 14mo)

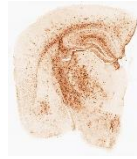


Whole brain region- and cell-type specific quantification

Input: Raw images



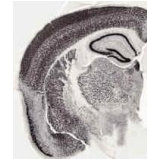
Nissl



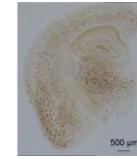
GFAP



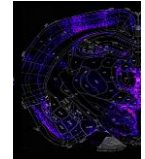
IBA1



NEUN

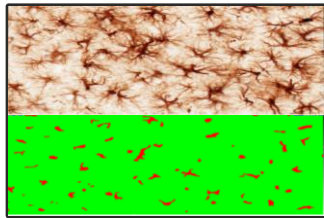


Aβ



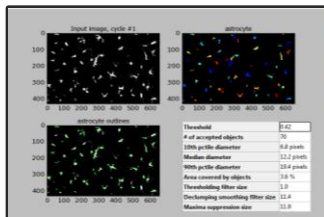
Arc-GFP

ilastik: interactive learning and segmentation toolkit
Sommer et. al 2011



Pixel classification

- Train on diverse images
- Refine “uncertainty” in classification



Object classification

- Train on diverse images
- Identify objects based on relevant parameters

QuickNII: image registration onto Allen Brain Atlas

Section alignment

- Nearest Nissl approach

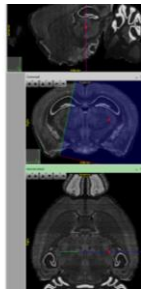
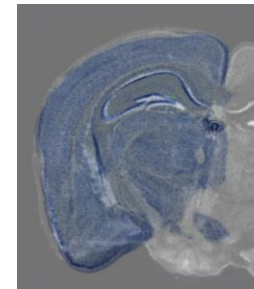
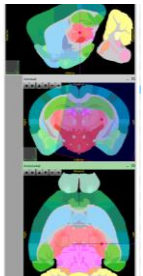
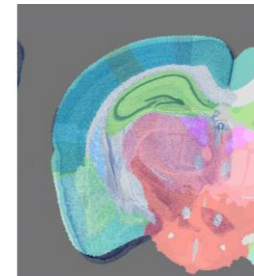
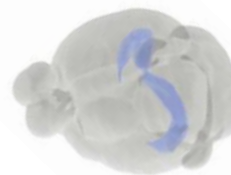


Image registration

- Define regional boundaries



Output: Region-specific quantification
3D reconstruction/visualization



Bjaalie, Bachelder and Neuner, unpublished