

BIOSTATISTICS CORE ADNI 2 SUMMARY & ADNI3 PLANS

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ADNI2 Results: Highlights

- The Biostatistics Core integrates data from all Cores to address implications for clinical trial design:
 - Comparing candidate biomarkers for potential for inclusion/exclusion, stratification, adjustment
 - Predictors of disease progression (to MCI or to AD)
 - Predictors of cognitive and functional decline
 - Comparing candidate biomarkers as outcome measures of change
 - Signal-to-noise ratio of change over 1-2 years
 - Correlation of change in biomarker with cognitive or functional change
 - Characterizing sequence of change, especially in preclinical and early stages
 - Identifying important subgroups in MCI

Predictors of progression from MCI to AD within 24 months

Marker	Effect Size			
FDG-R-UCB	1.19	Blue		
AV45-R-UCB	1.06	Blue		
Entr thickness	1.00	Blue		
Hpc vol	0.93	Blue	Orange	
CSF pTau	0.92	Blue	Orange	
CSF abeta	0.91	Blue	Orange	
CSF tau	0.87	Blue	Orange	
Entr vol	0.71	Blue	Orange	Red
Ventricles vol	0.38	Blue	Orange	Red
Whole brain vol	0.30		Orange	Red
W mat hyp	0.22			Red

- Measures with highest effect size for predicting progression are at top
- Effect size: how many SD separate the means for those that progress and those that do not
- Measures sharing colored bar are not significantly different after multiple comparisons

Predictors of change in ADAS-Cog in MCI (n=328)

Marker	Correlation	p-value						
FDG-R-UCB	-0.32	<0.01						
Entr thickness	-0.25	<0.01						
AV45-R-UCB	0.22	<0.01						
CSF pTau	0.19	<0.01						
CSF tau	0.18	<0.01						
CSF abeta	-0.15	<0.01						
Hpc vol	-0.14	<0.01						
Ventricles vol	0.12	0.02						
Entr vol	-0.09	0.12						
Whole brain vol	0.003	0.96						

- Many baseline markers correlated with increase in ADAS-Cog
- The same top 3 as for progression to AD
- Measures sharing colored bar are not different after multiple comparisons

Promising biomarkers for prediction in MCI

- Three different brain markers have at least a 1-SD difference between the baseline means for those that progress and those that do not and also correlate ($|r| \geq 0.2$) with ADAS-Cog change
 - FDG-PET summary measure (UC Berkeley)
 - AV45 cortical summary measure (UC Berkeley)
 - Entorhinal cortex thickness (UCSF, FreeSurfer)
- These markers, singly or in combination, could be used to improve clinical trial design by:
 - Inclusion of people more likely to progress
 - Exclusion of people more likely to stay stable, or
 - Stratifying by risk group

Assessing biomarkers in NC is harder

- Prediction of short-term progression to MCI is much weaker than MCI to AD
- Short-term change in ADAS-Cog is smaller and more variable, so harder to predict
- Instead, will see what does change

Signal-to-noise properties of 1-year change in NC

Marker	n/group								
CSF Abeta rate	13546								
WMHYP rate	7382								
AV45 rate	6873								
Entr volume rate	3810								
TOTAL13 rate	3223								
Hippocampal vol rate	3173								
CDR-sb rate	2880								
MMSE rate	1582								
CSF Tau rate	1548								
CSF PTau rate	1389								
Entr thickness rate	1130								
Whole brain vol rate	947								
TBM rate	516								
Ventricles vol rate	397								

- Sample size required for 1-yr trial in NC to detect 25% reduction in change
- Best precision (smallest sample size) at bottom
- Measures sharing colored bar are not significantly different after multiple comparisons

Validating change in markers: correlation with ADAS-Cog change in NC (n=206)

Marker	Correlation	p-value						
AV45-R-UCB	0.14	0.049						
Entr thickness	-0.12	0.09						
Entr vol	-0.12	0.10						
CSF abeta	-0.08	0.25						
CSF ptau	0.08	0.28						
Hpc vol	-0.07	0.33						
CSF tau	-0.06	0.41						
FDG-R-UCB	0.05	0.46						
Ventricles vol	-0.05	0.51						
Whole brain vol	-0.03	0.64						

- Increase in AV45 correlated with increase in ADAS-Cog
- No other association is significant
- Measures sharing colored bar are not significantly different after multiple comparisons

Promising markers for prediction in NC

- Less consistent than in MCI
- Some imaging measures have promising signal-to-noise ratios
 - Ventricular volume (FreeSurfer, UCSF)
 - TBM (Mayo)
 - Not as correlated with change in ADAS-Cog
- Baseline AV45 summary measure most correlated with change in ADAS-Cog
- Best marker to use in NC depends on goal

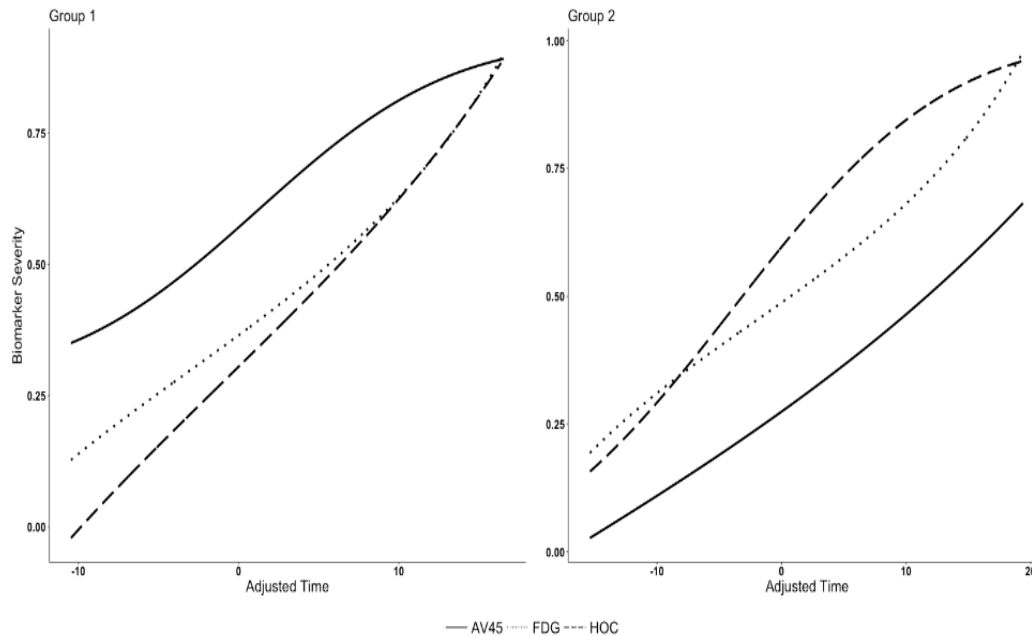
What about sequences of change in markers in NC and MCI?

- Clustering methods developed by Teresa Filshtein
- Utilizes longitudinal sequence of multiple markers to group “similar” people
- Applied to 339 participants (106 NC and 233 MCI) from ADNI-GO/ADNI-2
- Based on 3 markers
 - Hippocampal Occupancy (HOC; derived from UCSF FreeSurfer)
 - AV45 SUVR Summary Measure (UC Berkeley)
 - FDG-PET Summary Measure (UC Berkeley)
- Each measurement type transformed via weighted empirical distribution to get pseudo-centiloid measures (on 0 to 1 scale; 0=normal, 1=fully realized dementia)

Determining number of clusters

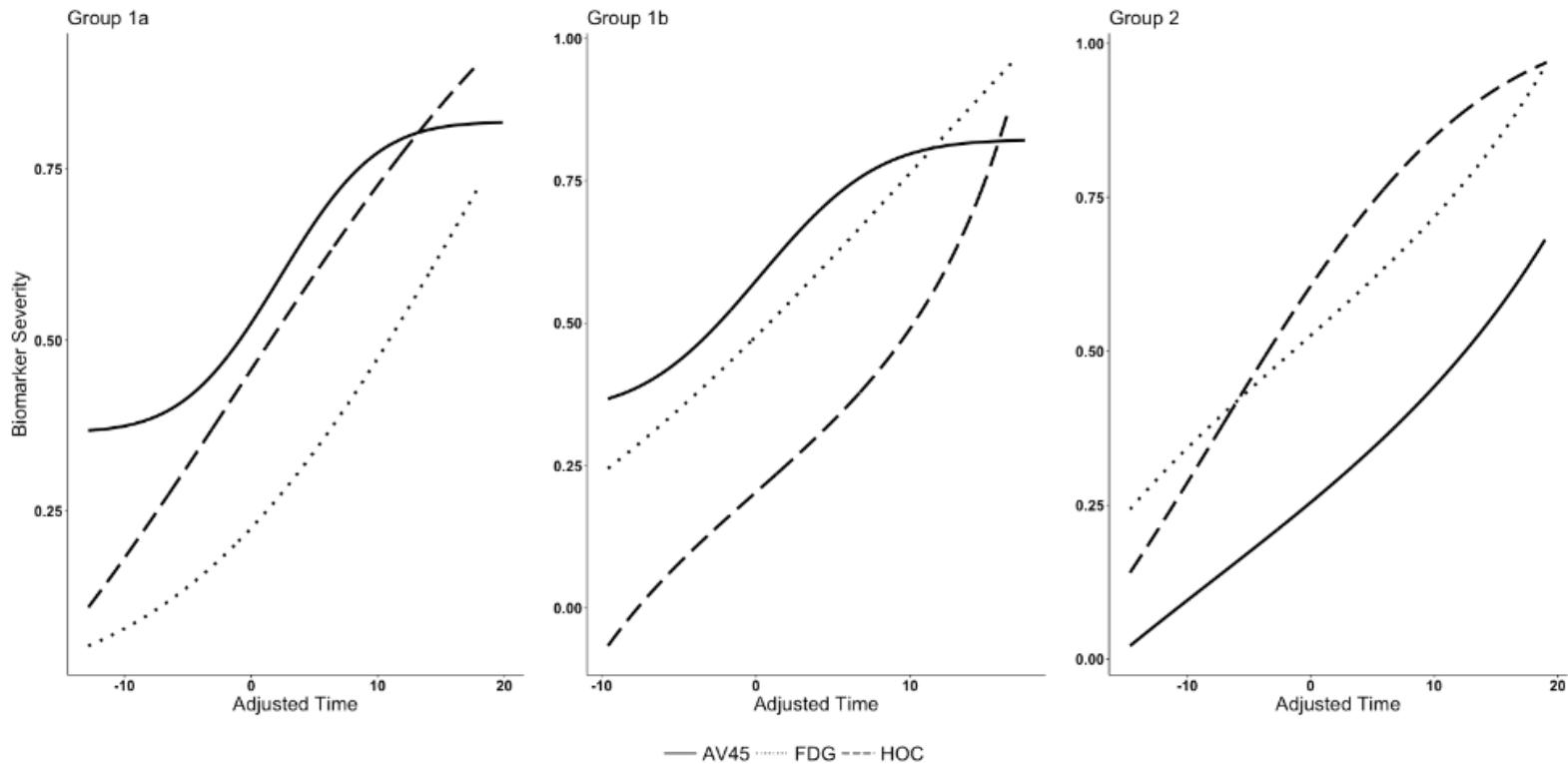
- Caliskin and Harabatz criterion – identified two syndromes
- Clinical relevance
 - Adapted a technique from Mike Donohue's approach for estimating trajectories within a single well-defined syndrome.
 - Technique identified 3 subgroups (essentially split one of the C-H groups)

Caliskan-Harabatz grouping



- Two syndromes
- Left side: amyloid 1st, then FDG, then HOC (54% of sample)
- Right side: FDG and HOC first, then amyloid (46% of sample)

Clinical relevance grouping

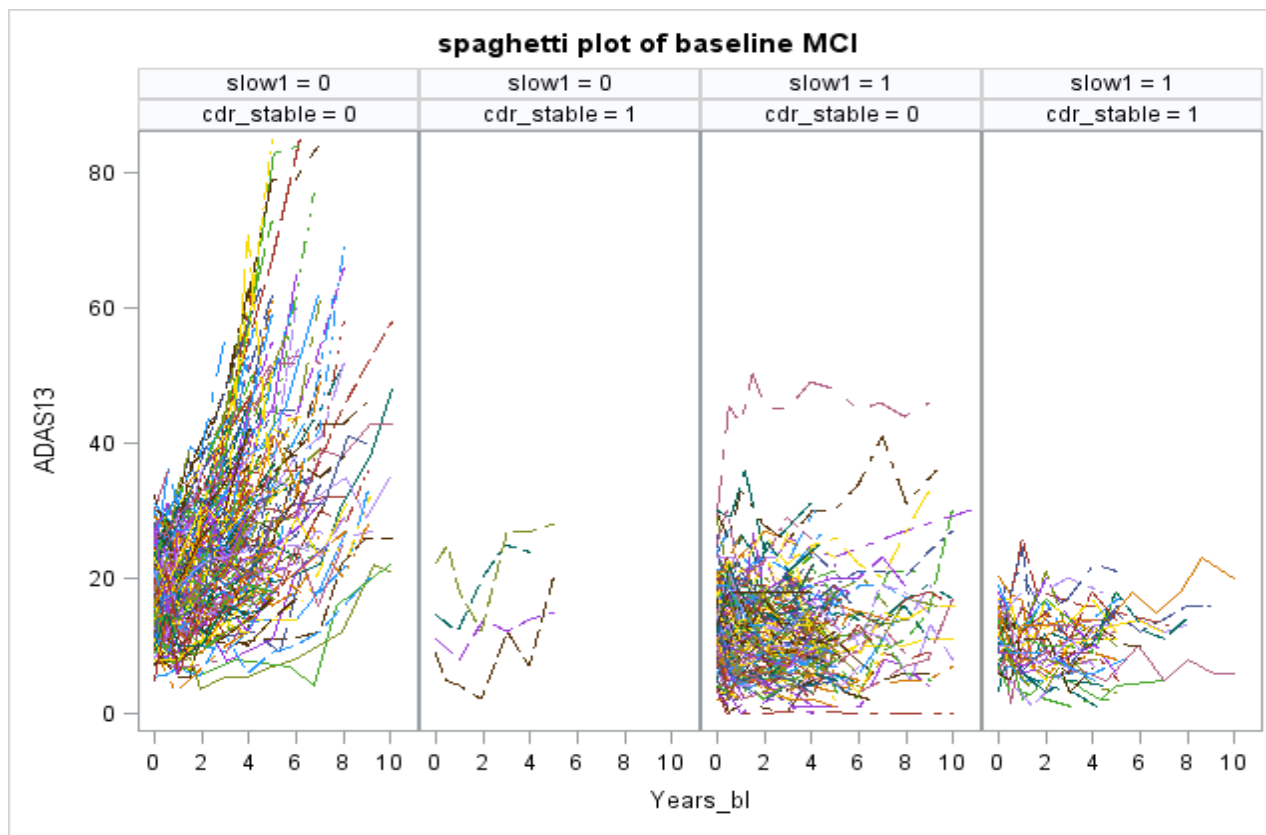


- Left side: amyloid first, then HOC, then FDG (31% of sample)
- Center: amyloid and FDG first, then HOC (29% of sample)
- Right side: FDG and HOC first, then amyloid (40% of sample)

What about subgroups in MCI?

- Interested in subgroup of MCI that remains stable
- Considered MCI (at baseline) from ADNI-1, GO, 2 (includes EMCI)
- Computed person-specific slopes in ADAS-Cog
 - Split according to slow changer (slope < 1) or not
- Further evaluated change in CDR Sum of Boxes (stable=1st and last score equal)

Spaghetti plots of ADAS-Cog

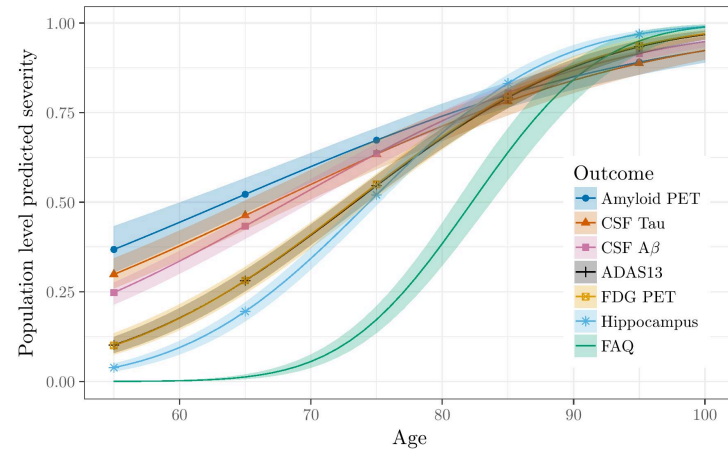
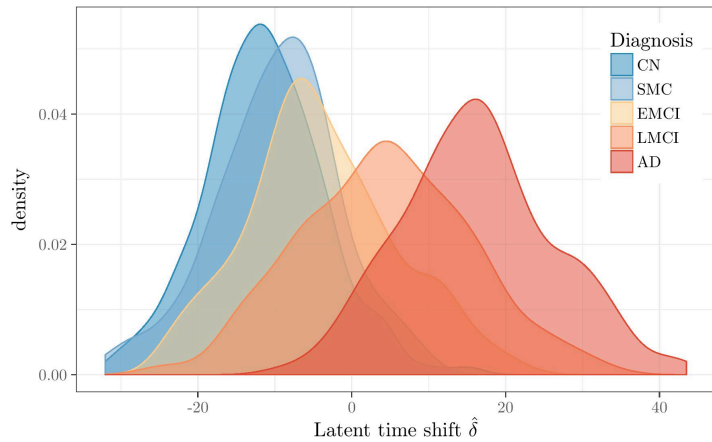


Which markers differ between those that remain stable and those that change? Something informative/protective in those that remain stable?

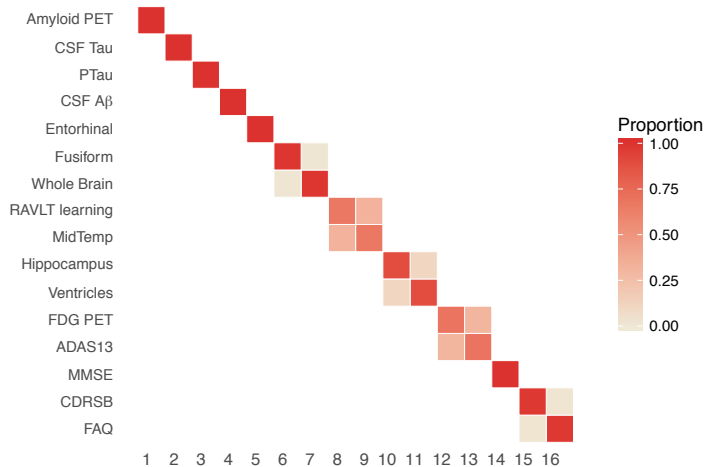
ADNI3: toward better clinical trials

- We will assess new candidate markers (including from tau imaging), looking for markers with:
 - Sensitivity to change in early disease (at baseline, over time)
 - Good signal-to-noise properties
 - Correlated with relevant clinical change
 - Plausibility as surrogate marker and intervention target
- Also consider new clinical outcome measures (such as CogState) and how they might help in early disease
 - Sensitivity to early change
 - Good signal-to-noise properties

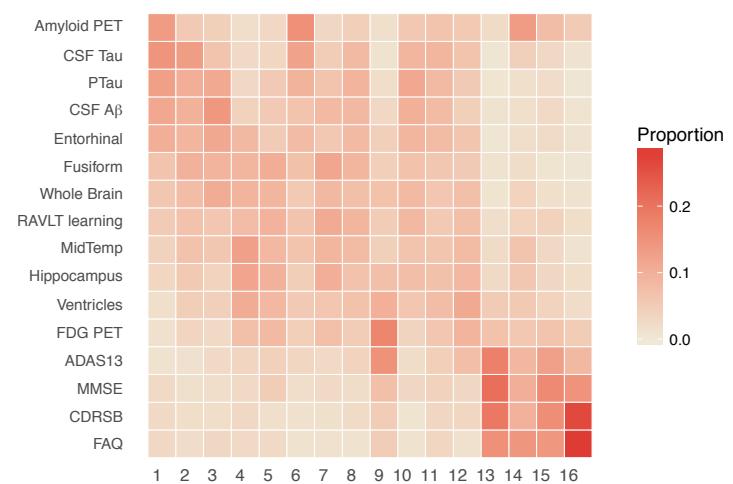
Bayesian Latent Time Joint Mixed-Models



Population-level predicted order



Subject-level predicted order (*APOE* ϵ 4+)



Submitted to *Stat Meth Med Res*. Preprint:

<https://arxiv.org/abs/1703.10366>

AAIC Workshop on Clin Trials Methods

Friday July 14 8am-5pm

- Longitudinal data analysis, MMRM, Missing Data
 - Mike Donohue, USC
- Simulation and Trial Enrichment
 - Jeannie-Marie Leoutsakos, Johns Hopkins
- Adaptive Trial Design
 - Joyce Chang, University of Pittsburgh
- Expedition trial design: Delayed Start Analyses
 - Hong Liu-Seifert, Eli Lilly