

# EVALUATION OF AD BIOMARKERS IN ABSENCE OF A GOLD STANDARD

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# Outlines

- Background
- Mixture model approach and previous study
- Cautions on previous study
- Another analysis with data from Penn ADC
- Discussion and work in progress
- Acknowledgement

# Background

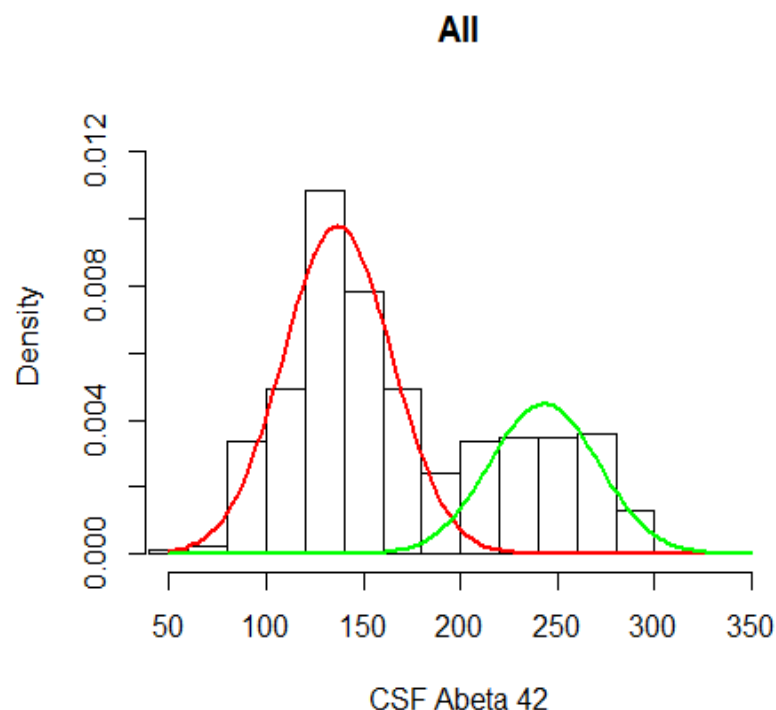
- The pathophysiological process of Alzheimer's disease (AD) is thought to begin many years before the diagnosis of AD dementia
- Various biomarkers are proposed for early AD diagnosis. -
  - CSF/blood amyloid beta and tau protein
  - structural MRI
  - PET-amyloid imaging
- Gold standard is hard to obtain
  - long “preclinical” phase of AD
  - limited data on autopsy
  - errors in clinical AD diagnosis, comorbidity

# Previous Study

- Geert De Meyer et al (2010) use a mixture model approach to assess the ability of several biomarkers in the early detection of AD
  - the analysis did not use clinical AD diagnosis
  - unobserved status related to AD pathology is considered as a latent variable
  - normality or multivariate normality assumption
  - A $\beta$  1-42, total tau, P-tau<sub>181P</sub>
- $P(\text{Biomarkers}) = P(D=0) P(\text{Biomarkers} \mid D = 0)$   
+  $P(D=1) P(\text{Biomarkers} \mid D = 1)$

# Reproduced Results

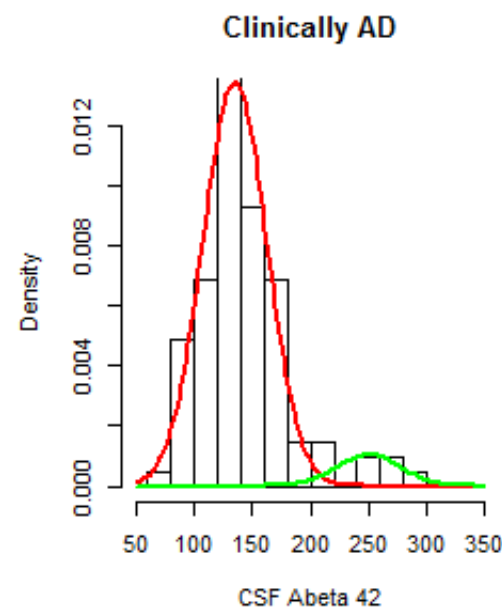
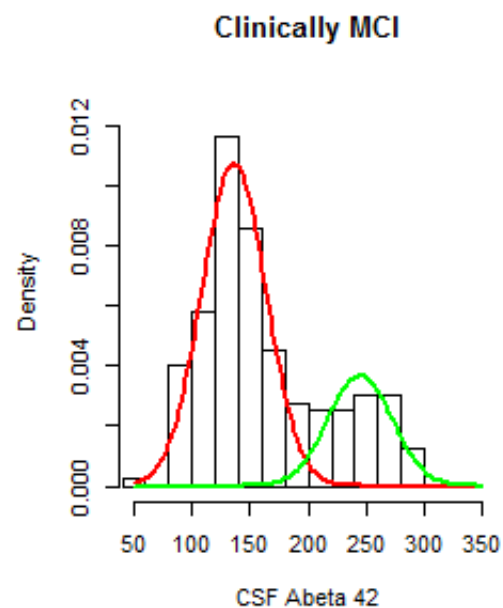
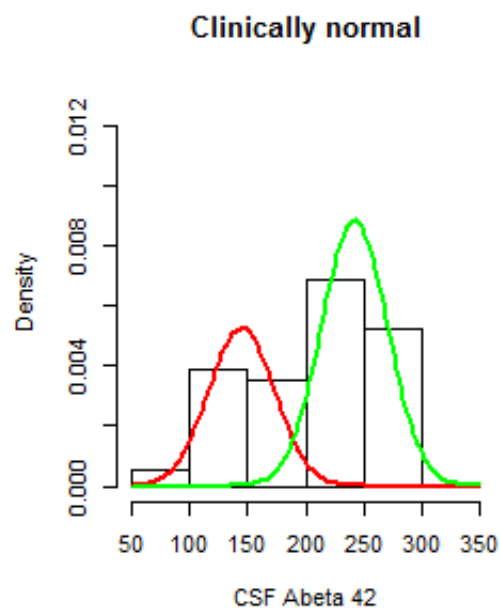
- Data: Alzheimer's Disease Neuroimaging Initiative (ADNI)
- Results for CSF A $\beta$  1-42
- Two groups fitted by mixture model with normality assumption.
  - red line: group with AD feature
  - green line: group without AD feature



		Proportion	Mean	Sigma
All	Group with AD feature	0.68	136.5	27.5
	Group without AD feature	0.32	242.4	28.6

# Reproduced Results

- Results in subgroups based on clinical diagnosis



# Reproduced Results

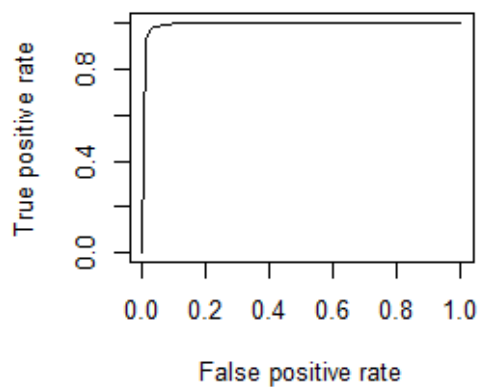
- Results in subgroups based on clinical diagnosis

		Proportion	Mean	Sigma
All	Group with AD feature	0.68	136.5	27.5
	Group without AD feature	0.32	242.4	28.6
Normal	Group with AD feature	0.38	145.8	29.3
	Group without AD feature	0.62	242.5	27.7
MCI	Group with AD feature	0.74	135.8	27.4
	Group without AD feature	0.26	243.9	28.2
AD	Group with AD feature	0.92	134.3	27.0
	Group without AD feature	0.08	245.9	32.0

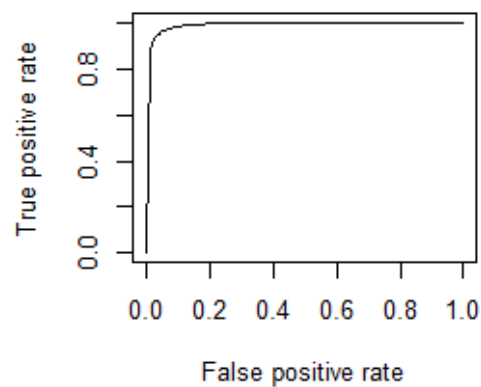
# ROC curves



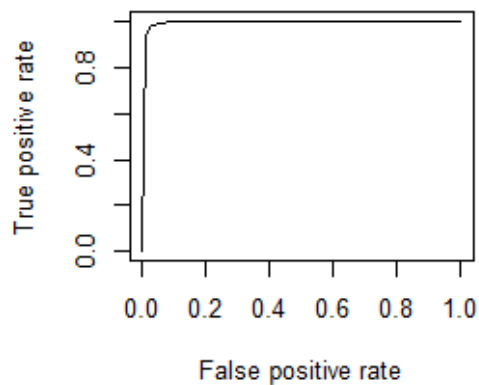
**ROC curve all**



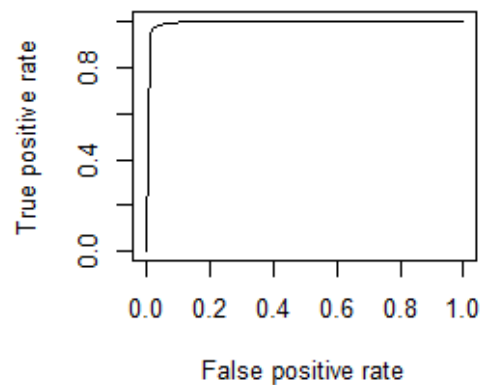
**Clinically normal**



**Clinically MCI**



**Clinically AD**





# Caution

- Crucial assumption:
- 1. Biomarker values are normally distributed in each group, i.e., group with AD feature and group without AD feature
  - Normality assumption may not hold in practice
  - Log transform is used in their analysis for total tau, P-tau<sub>181P</sub>
- 2. Disease prevalence and biomarker performance is homogeneous in the population
  - may depend on other covariates such as age, gender, etc.

# Data

- Data from Penn's Alzheimer's disease Center

- **Inclusion Criteria:**

All data from Penn ADC that was uploaded to UDS subjects with at least one CSF biomarker measurement.

- As of May 14, 2012, there are 1058 unique subjects uploaded to UDS, of which 362 (34.2%) subjects have at least one CSF measurement.
- 6 subjects based on Elisa assay are excluded.

Assay type	Number (%)
Elisa	6 (1.7%)
Luminex	356 (98.3%)

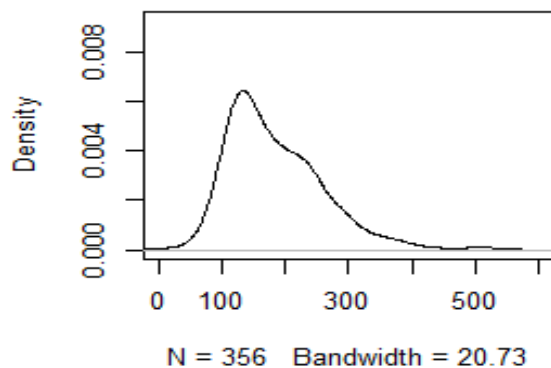
# Descriptive Results

Characteristic		Mean (SD) or number (%) Visit closest to CSF sample
T-tau		85.9 ( $\pm$ 60.8)
P-tau		34.9 ( $\pm$ 24.7)
A-beta42		184.1 ( $\pm$ 74.6)
Sex=Male		153 (43.0%)
Age (years)	at CSF sample	72.3 ( $\pm$ 9.1)
	at Assay	73.8 ( $\pm$ 9.8)
	at initial visit in UDS	73.1 ( $\pm$ 9.3)
Race	White	293 (82.3%)
	Black or African American	33 (9.3%)
	Asian	3 (0.8%)
	Other	27 (7.6%)
Education (years)		15.0 ( $\pm$ 7.5)
MMSE		23.85 ( $\pm$ 7.2)
CDR-SB		3.57 ( $\pm$ 3.65)
Clinical Diagnoses	Normal	73 (20.5%)
	Amnestic MCI	75 (21.1%)
	Any MCI	85 (23.9%)
	Demented	190 (53.4%)
	AD demented	141 (39.6%)
CDR	0	69 (19.4%)
	0.5	164 (46.1%)
	>0.5	123 (34.6%)

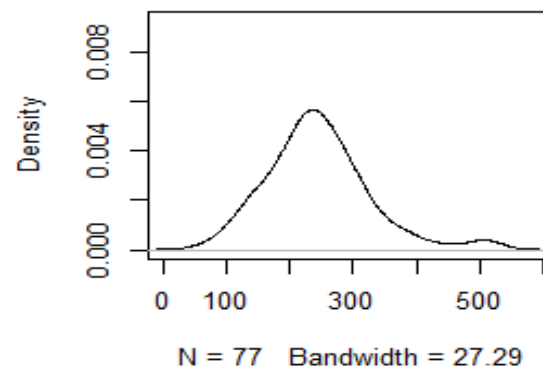
# Empirical Densities

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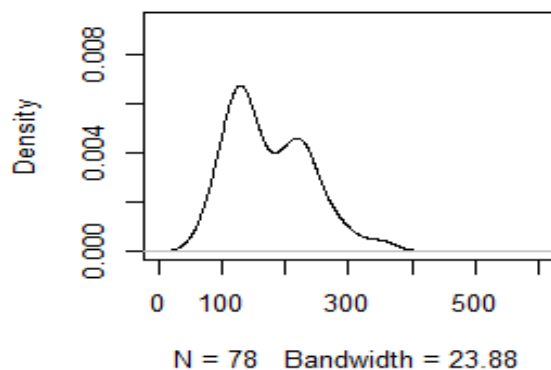
**Abeta-42 all**



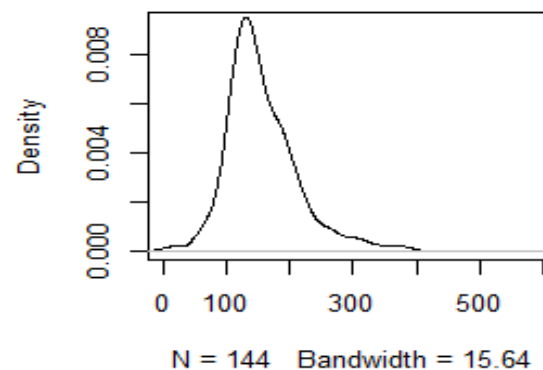
**Abeta-42 Normal**



**Abeta-42 MCI**



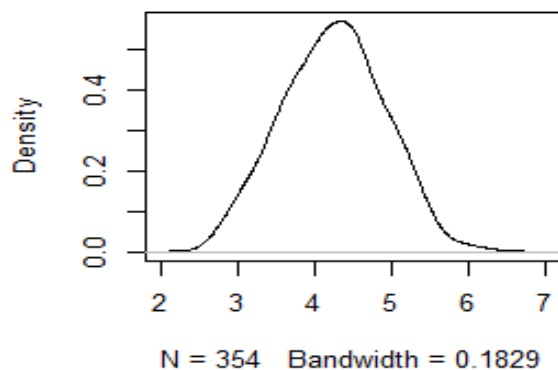
**Abeta-42 AD-Demented**



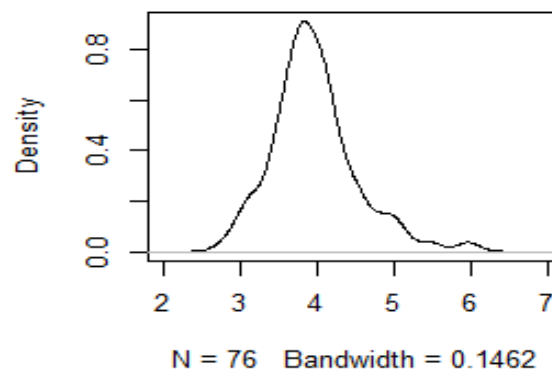
# Empirical Densities



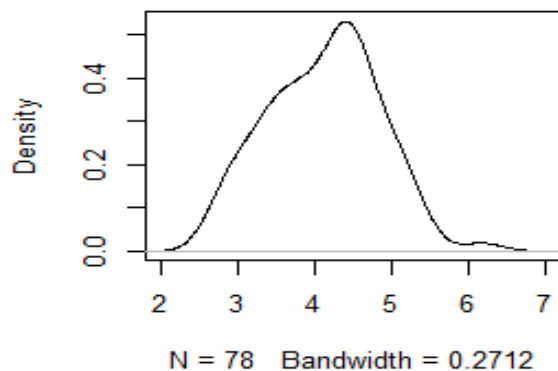
**log t-Tau all**



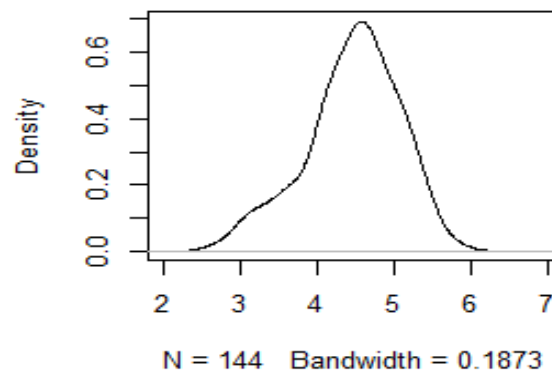
**log t-Tau Normal**



**log t-Tau MCI**



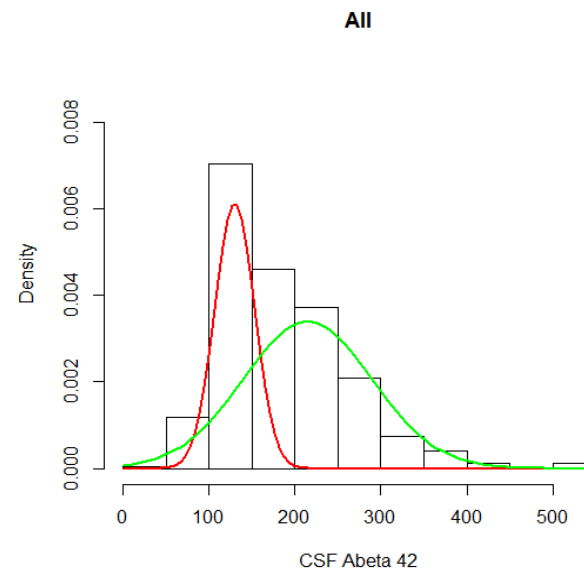
**log t-Tau AD-Demented**



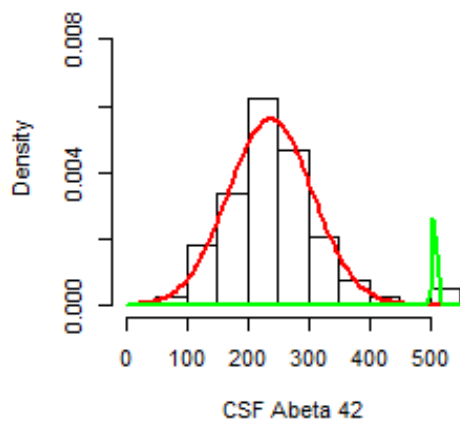
# Results for A $\beta$ 1-42

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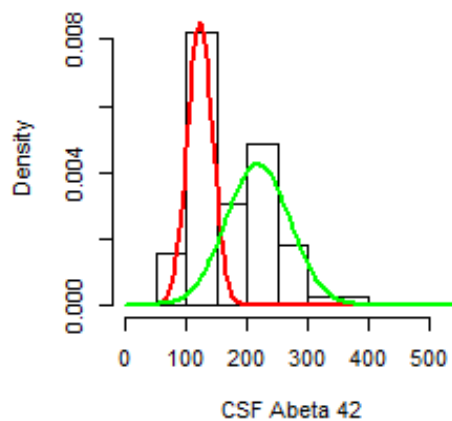
		Proportion	Mean	Sigma
<b>All</b>	AD feature	0.36	129.3	23.3
	Non AD	0.64	214.5	75.8
<b>Normal</b>	AD feature	0.97	237.8	69.4
	Non AD	0.03	507.5	3.67
<b>MCI</b>	AD feature	0.44	121.4	20.7
	Non AD	0.56	216.9	52.4
<b>AD</b>	AD feature	0.67	138.4	31.5
	Non AD	0.33	192.8	73.4



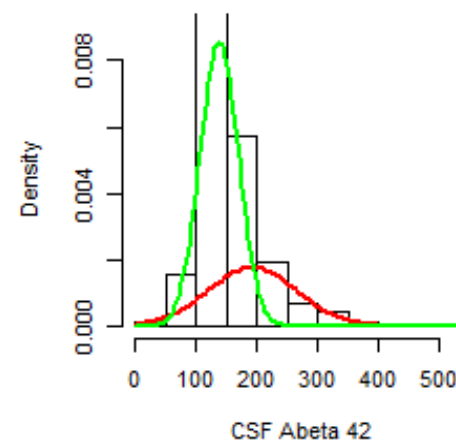
**Clinically normal**



**Clinically MCI**



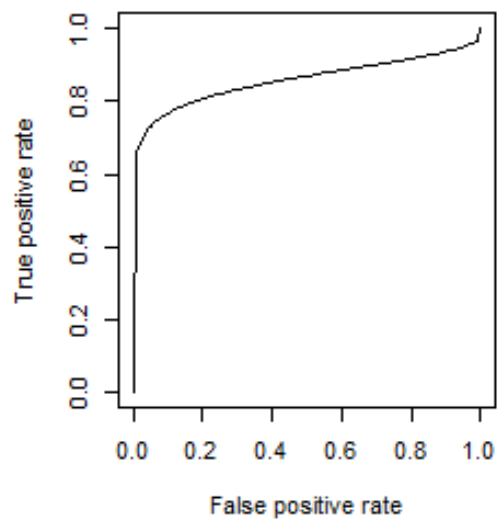
**Clinically AD**



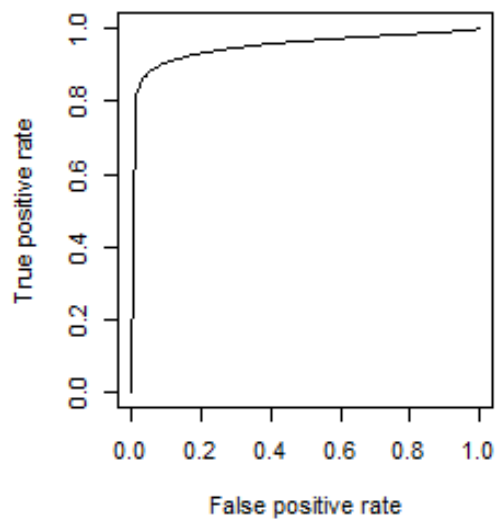
# ROC curves

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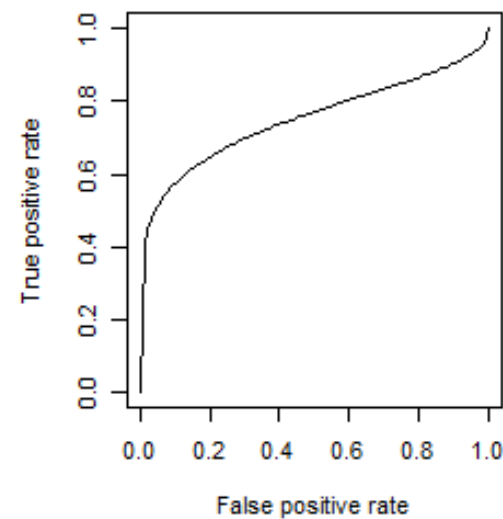
ROC curve all



Clinically MCI



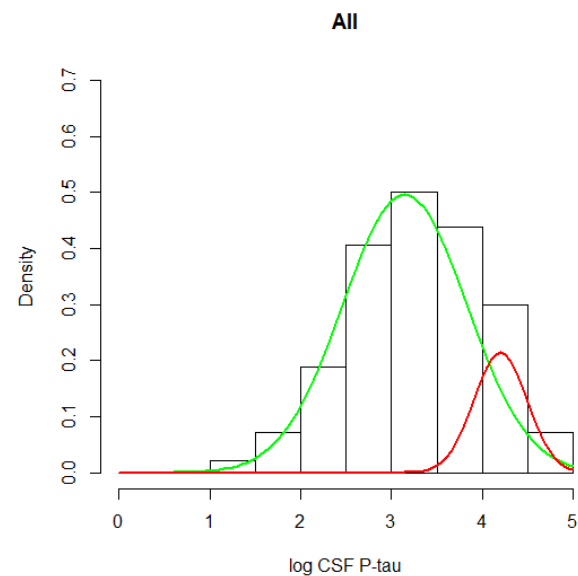
Clinically AD



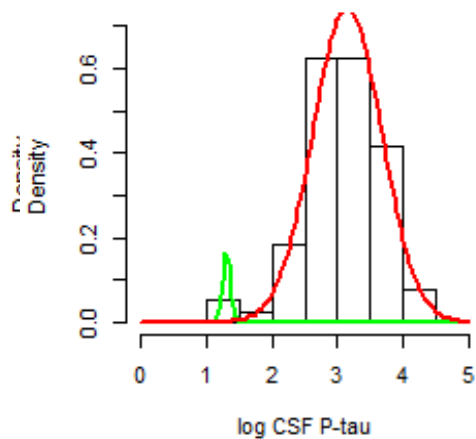
# Results for P-tau<sub>181P</sub>

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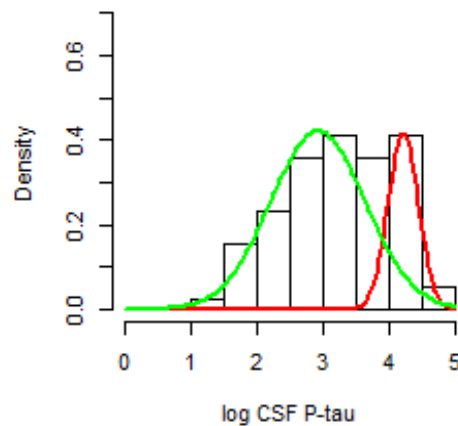
		Proportion	Mean	Sigma
<b>All</b>	Non AD	0.84	3.14	0.67
	AD feature	0.15	4.22	0.27
<b>Normal</b>	Non AD	0.03	1.31	0.06
	AD feature	0.97	3.15	0.52
<b>MCI</b>	Non AD	0.76	2.92	0.72
	AD feature	0.24	4.21	0.23
<b>AD</b>	Non AD	0.71	3.23	0.64
	AD feature	0.29	4.18	0.31



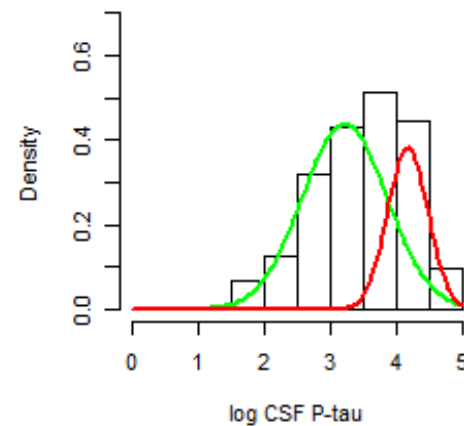
**Clinically normal**



**Clinically MCI**



**Clinically AD**

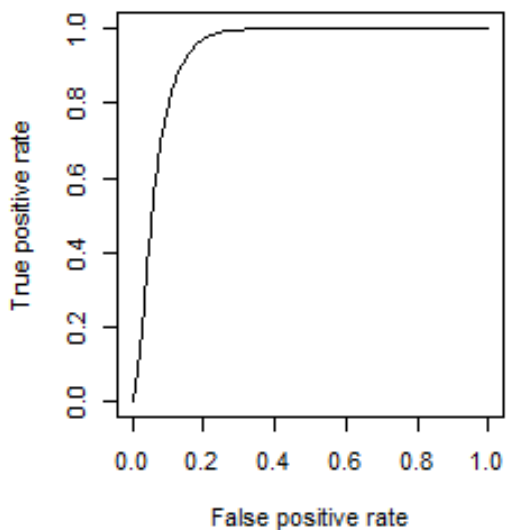




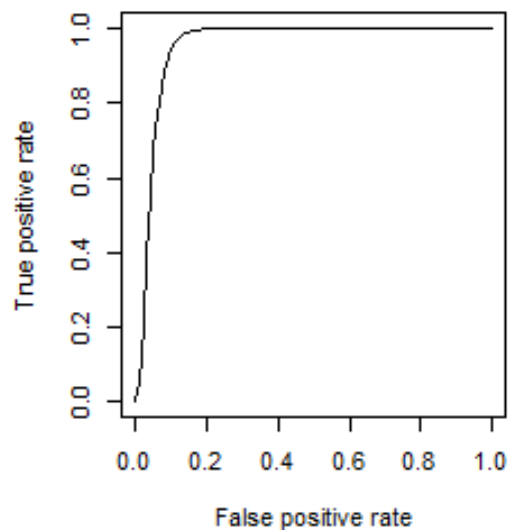
# ROC curves

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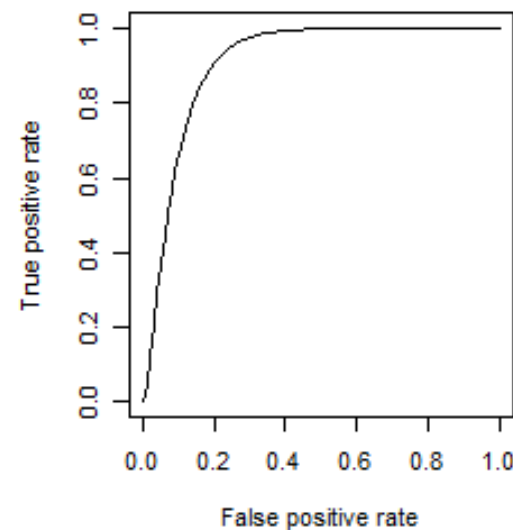
ROC curve all



Clinically MCI



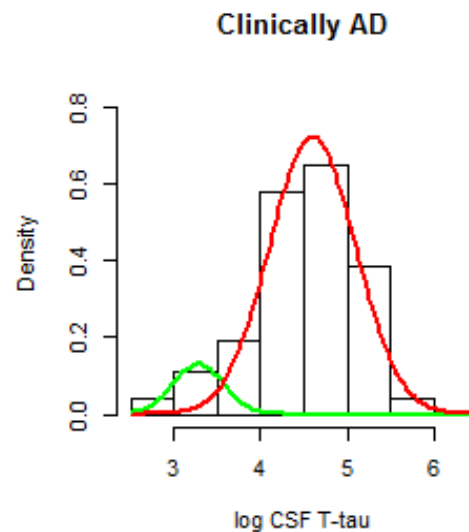
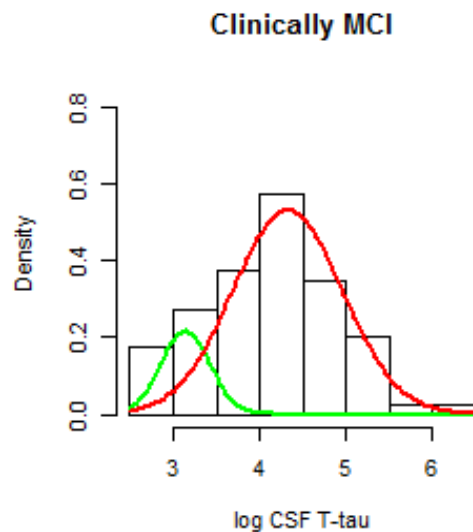
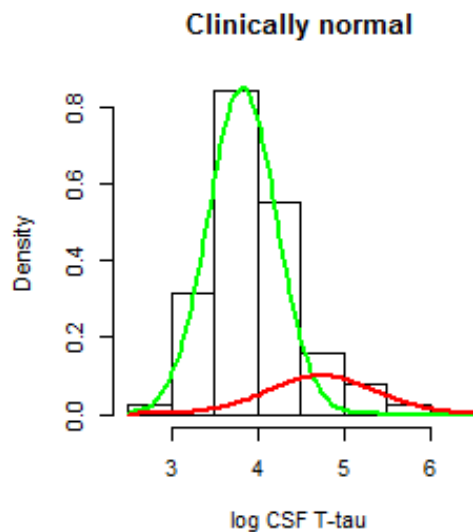
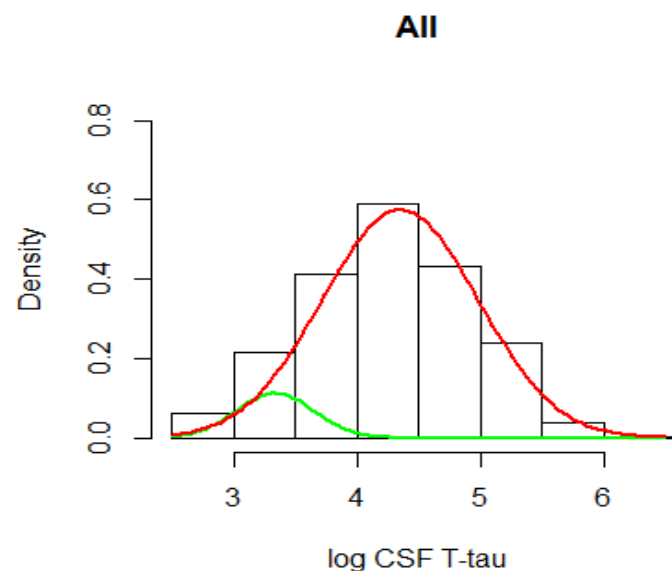
Clinically AD



# Results for total tau

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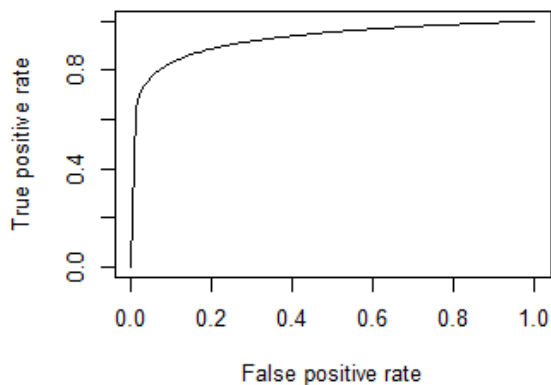
		Proportion	Mean	Sigma
<b>All</b>	Non AD	0.13	3.37	0.34
	AD feature	0.87	4.37	0.59
<b>Normal</b>	Non AD	0.84	3.82	0.40
	AD feature	0.16	4.73	0.63
<b>MCI</b>	Non AD	0.19	3.18	0.30
	AD feature	0.81	4.34	0.60
<b>AD</b>	Non AD	0.11	3.31	0.31
	AD feature	0.89	4.60	0.47



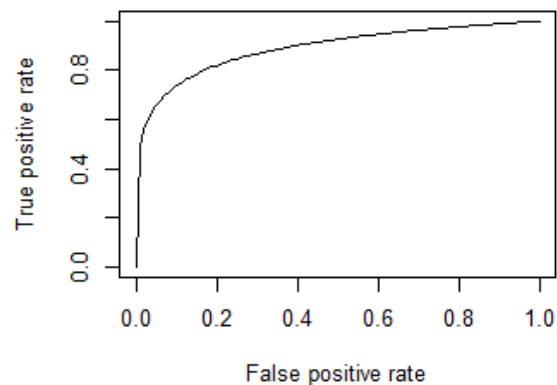
# ROC curves



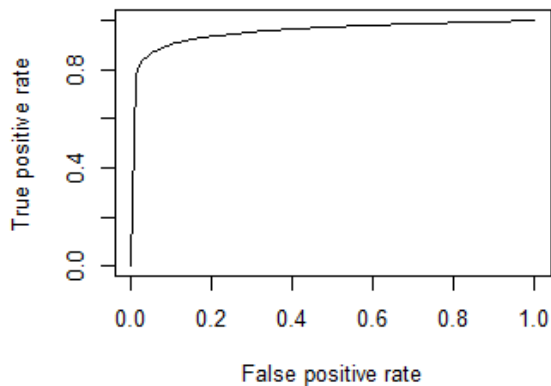
**ROC curve all**



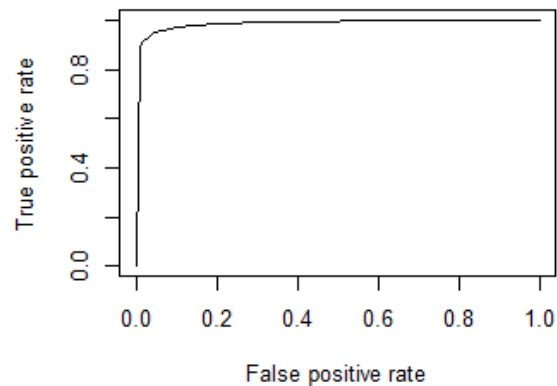
**Clinically normal**



**Clinically MCI**



**Clinically AD**



# Discussion

- In groups with clinical diagnosis of MCI or AD, group with AD feature occupied a bigger proportion comparing to group that is clinically normal.
- Changes in p-tau occur later in disease progress comparing to  $A\beta$  and t-tau (indicated by smaller proportion of subjects with AD feature), yet t-tau seems to be even earlier than  $A\beta$  based on the analysis results.
- Results about t-tau are the most similar to results of De Meyer, while results about  $A\beta$  and P-tau suggest some discrepancy.

# Discussion

- ADNI data has more strict inclusion and exclusion criterion, less outliers and less affected by comorbidity and other complications.
- Data from Penn's ADC may be closer to most data from practice
- Are the results reflect the data well? Do the assumptions hold in these data?

# Work in progress

- Allow transformation model on biomarker values to relax the normal or multivariate normal assumption
  - Box-cox transformation
  - non-parametric transformation
- Allow prevalence and biomarker values depends on patients characteristics

# Acknowledgments

- Penn's Alzheimer's Disease Center
- NACC Intramural Research and Data groups
- NIA
  
- No disclosures

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