

Wenjun Zhu¹, So-Youn Shin¹, Jeanne Latourelle¹

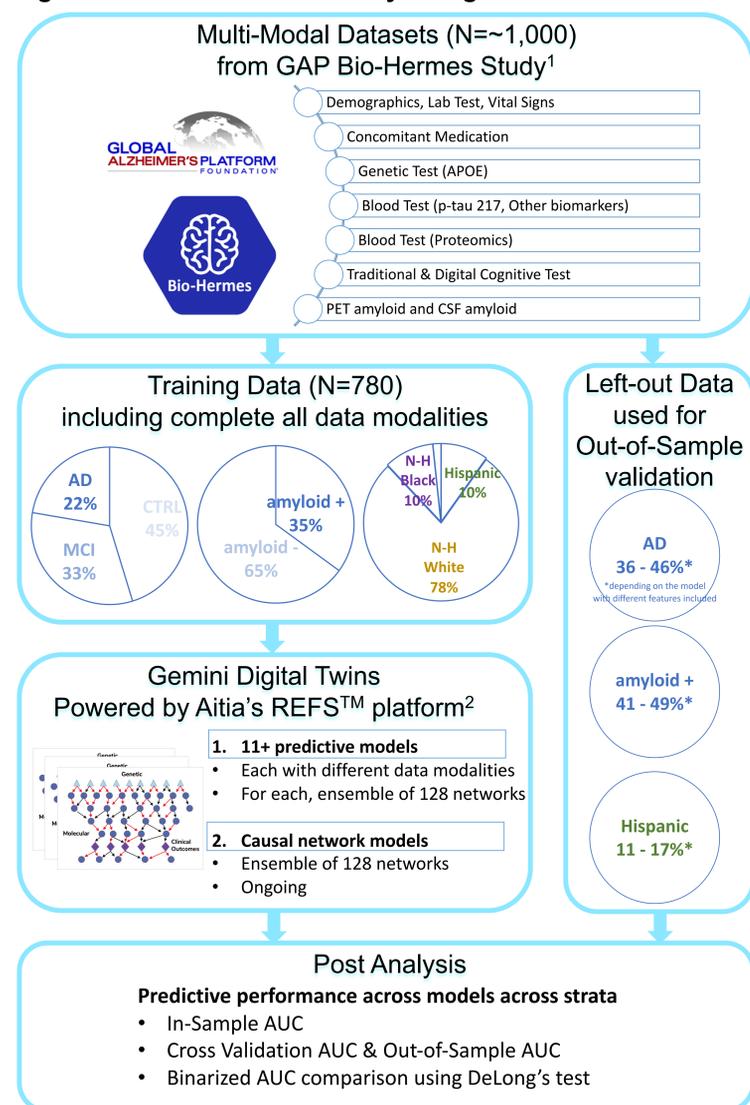
¹ Aitia, Somerville, MA, USA

OBJECTIVE

- To identify individuals positive for amyloid PET results in a more cost-effective and convenient manner, accessible to a larger at-risk population
- To understand the contribution of different sources of data to the prediction of PET positivity and evaluate prediction performance across different racial & ethnic groups and disease stages

DATA AND METHODS

Figure 1. Workflow of the Study Design



Gemini Digital Twins

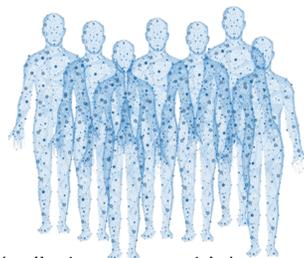
'Gemini Digital Twins' are virtual patients modeled and simulated using the REFS™ AI platform² as follows.

Reverse Engineering

- Each Gemini Digital Twins is comprised of a total of 128 Bayesian network models (called an ensemble) built from the training data.
- A Bayesian network model is a directed graphical representation of relationships between variables where each node denotes a variable, and each arrow denotes a conditional dependency.

Forward Simulation

- Patient-level outcome values can be simulated in the Gemini Digital Twins, by *in silico* counterfactual experiments which computationally estimate the outcome values through model interventions, known in causal inference as 'Do' operations.
- These estimations are done fully adjusting for any confounding effects identified in the causal models, which is necessary in causal inference as emphasized in randomized experiments.



RESULTS

Table 1. Predictive Performance of 11 models built from different data sources were compared using DeLong's Test of significant AUC Difference ($p < 0.05$) to group into tiers of models with similar performance.

Model**	AUC	Model Tier defined by DeLong's Test ($p > 0.05$)
**Including age, sex, race, ethnicity as predictors by default		
All data w/ p-tau 217	0.936	Tier 1: Highest performance • Models including most or all key molecular markers performed equivalently to models using all available data • p-tau 217, the strongest individual marker, is able to predict Amyloid+ as well as complete data • Combining other blood biomarker data (amyloid ratio, p-tau 181, etc.), recovers all of predictive power of p-tau217, as models excluding it perform equivalently to model with it
All data w/o p-tau 217	0.933	
Biomarkers w/ p-tau 217	0.936	
Biomarkers w/o p-tau 217	0.895	
p-tau217	0.911	
Proteomics	0.838	Tier 2: Slightly reduced performance • Predicting Amyloid+ using only either proteomics or APOE4 genotyping also demonstrated strong performance
APOE4	0.797	
Self-reported clinical	0.71	Tier 3: Lower performance suitable for pre-screening • Various combinations of non-molecular clinical and cognitive measures predicted the outcome with a lower level of accuracy than the molecular features • The set of "easily accessible" self-reported clinical- and digitally assessed cognitive test data was equivalent to the traditional cognitive test • Easily accessible measurement set may have utility as more broadly implemented pre-screening tool
Digitally assessed cognitive test	0.681	
Traditionally assessed cognitive test	0.752	
EasilyAccessible Self-reported clinical + Digitally assessed cognitive test	0.72	

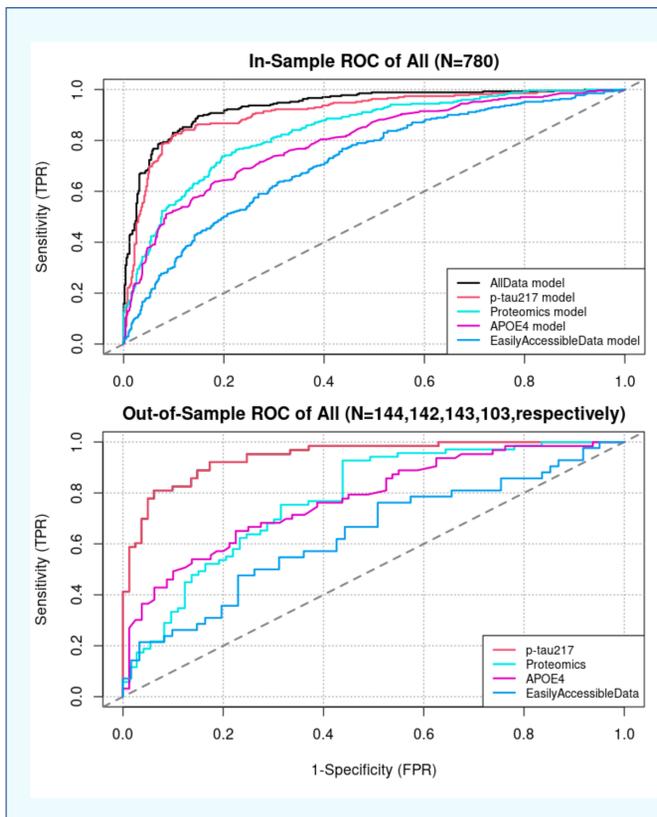
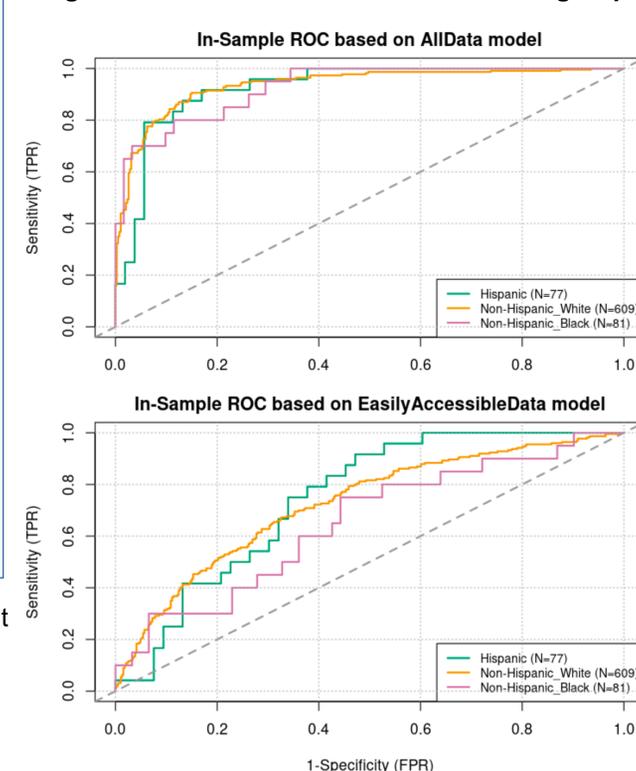


Figure 2. Representative models were tested in independent left-out cohorts and showed similar trends in performance.

Figure 3. Performance across ethn racial groups



- Performance of the models was consistent across different ethnic and racial groups for all data sources (All Data and Easily Accessible data models shown in Figure 2).
- Performance was consistent in 5-fold cross validation where median AUCs were within <1% of in-sample demonstrating robustness of models.

CONCLUSIONS

- Digital Twins showed that a blood-based biomarker, p-tau 217, is the most effective biomarker in general, corroborating previous studies.
- Digital Twins can maintain equivalent predictive performance with other blood biomarkers even in the absence of p-tau 217 and can allow utilization of easily accessible and self-reported data in a cost-effective screening approach.
- When powered by sufficient data, as collected in Bio-Hermes study, Digital Twins are able to generate equally accurate predictions in under-represented populations.
- Digital Twins can be further explored for causal inference including understanding the causal relationships among biomarkers, proteins, and disease features, potentially allowing rich understanding of biomarkers, surrogate endpoints, and disease mechanisms.

REFERENCES

- <https://globalalzplatform.org/biohermesstudy/>
- Latourelle JC, et al. Lancet Neurol. 2017. PMID: 28958801. [https://doi.org/10.1016/S1474-4422\(17\)30328-9](https://doi.org/10.1016/S1474-4422(17)30328-9)