

Count data model for Alzheimer disease progression MMSE score using MonolixSuite

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INTRODUCTION

Progression models for Alzheimer’s disease (AD) allow to better understand predictors of progression and help to design informative clinical trials. Common scores used to follow AD progression include ADAS-cog, CDR-SB and MMSE. Most published models consider the score as a continuous variable.

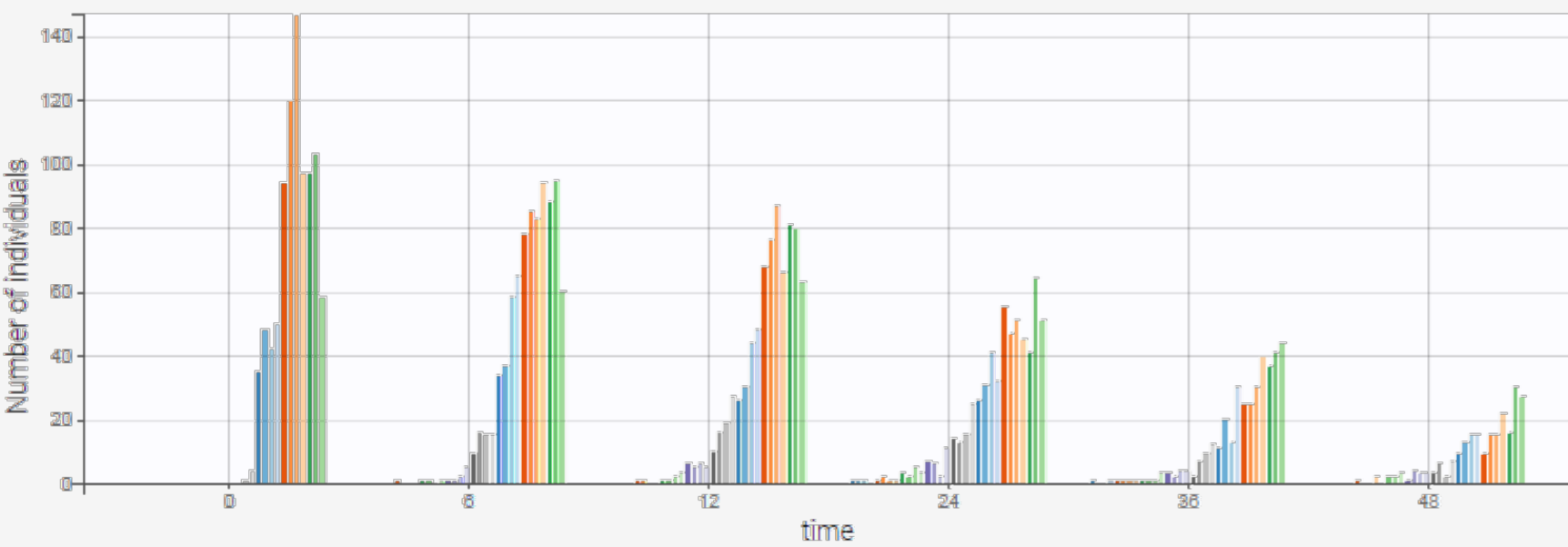
In this poster, we propose a novel model for the MMSE score which captures the score as bounded count data. The model is implemented and estimated in Monolix.

How to implement a model for count data in Monolix?

MMSE scores were extracted from the ADNI study [1] for 895 patients examined every 6 months over 2 years. Available covariates include age, weight, height, sex, BMI, race, baseline MMSE score and number of apolipoprotein E type 4 alleles (APOE).

1/ Which model describes best the disease progression?

2/ Which covariates are predictors of the progression?

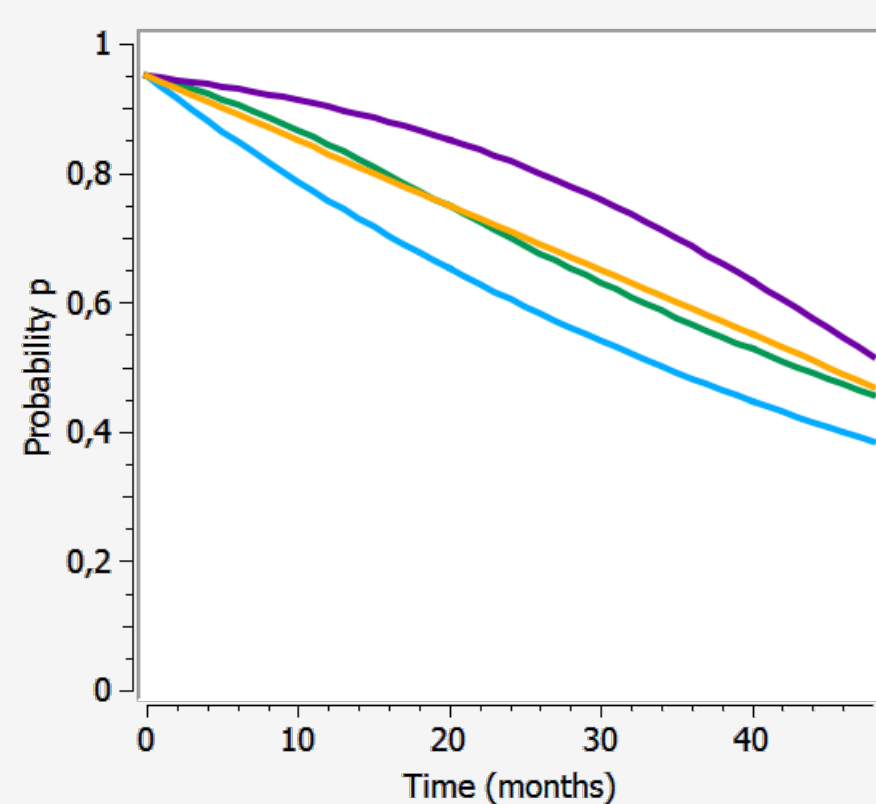


MODEL FORMULATION

The MMSE scores is modeled using a binomial distribution representing the number of correct answers to the n=30 questions of the MMSE test. The probability p of correct answer decreases as the AD progresses.

$$P(\text{MMSE} = k) = \binom{n}{k} p^k (1 - p)^{n-k}$$

Several models are tested to describe the evolution of the probability p.



Linear

$$p = p_0 - \alpha t$$

Exponential

$$p = p_0 \exp(-\alpha t)$$

Logistic

$$p = \frac{p_0}{p_0 + (1 - p_0) \exp(-\alpha t)}$$

Richard

$$p = \frac{p_0}{(p_0^\beta + (1 - p_0^\beta) \exp(-\alpha \beta t))^\beta}$$

[LONGITUDINAL]
input={p0, alpha}

EQUATION:
; probability of success => decreases over time
p = p0 / ((p0 + (1-p0)*exp(alpha*t)))
n = 30

DEFINITION:
; binomial distribution of n trials and probability of success p
MMSE = {type=count, log(P(MMSE=k))= factln(n)-factln(k)-factln(n-k) + k*log(p) + (n-k)*log(1-p) }

OUTPUT:
output = MMSE

Model implementation in Mlxtran language for Monolix

RESULTS

Among the four tested models for the evolution of the probability p, the logistic model which has a concave shape captures the data best.

	-2LL	BIC
Linear	16996	17030
Exp.	16993	17027
Logistic	16913	16947
Richard	16911	16973

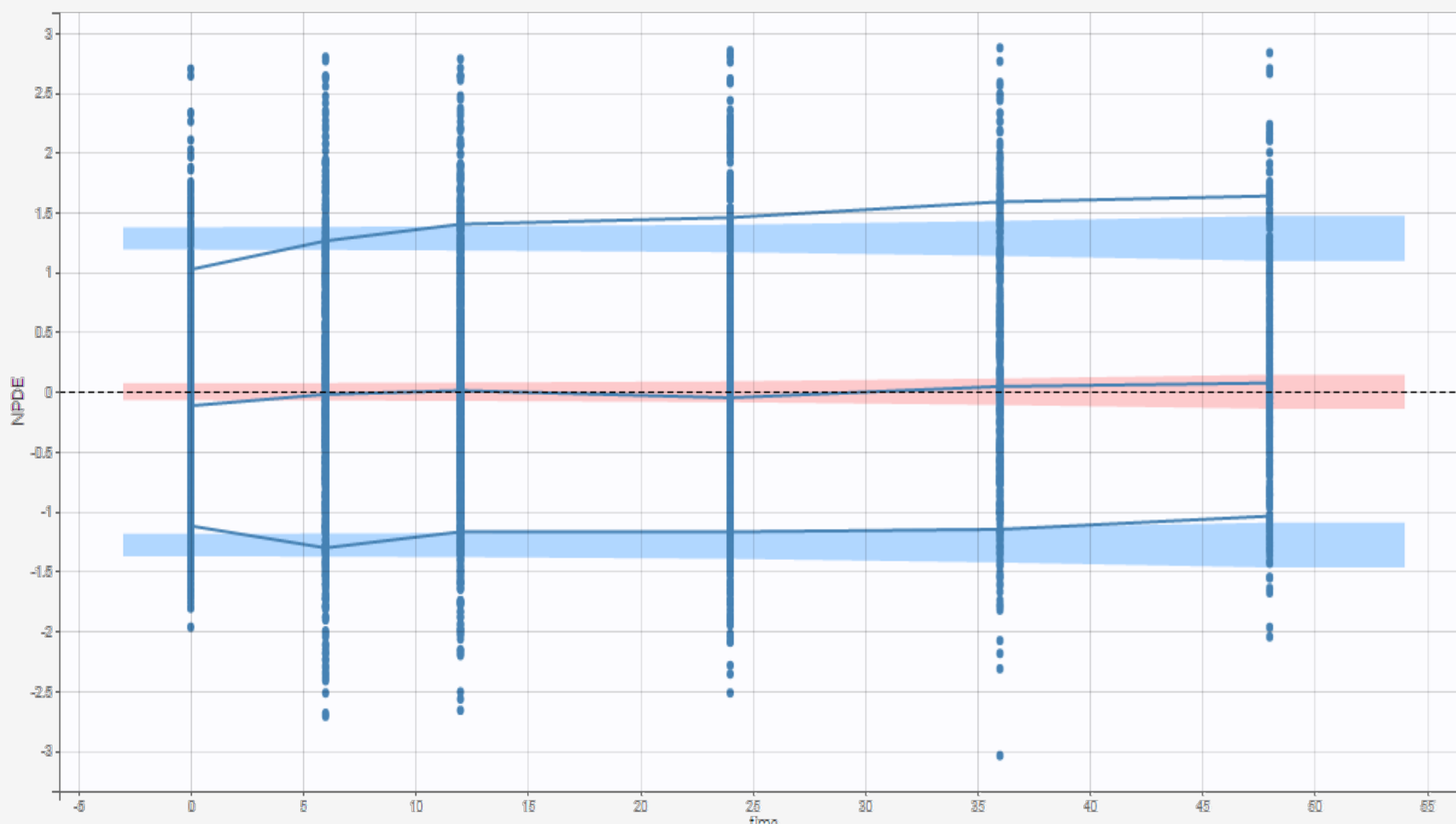
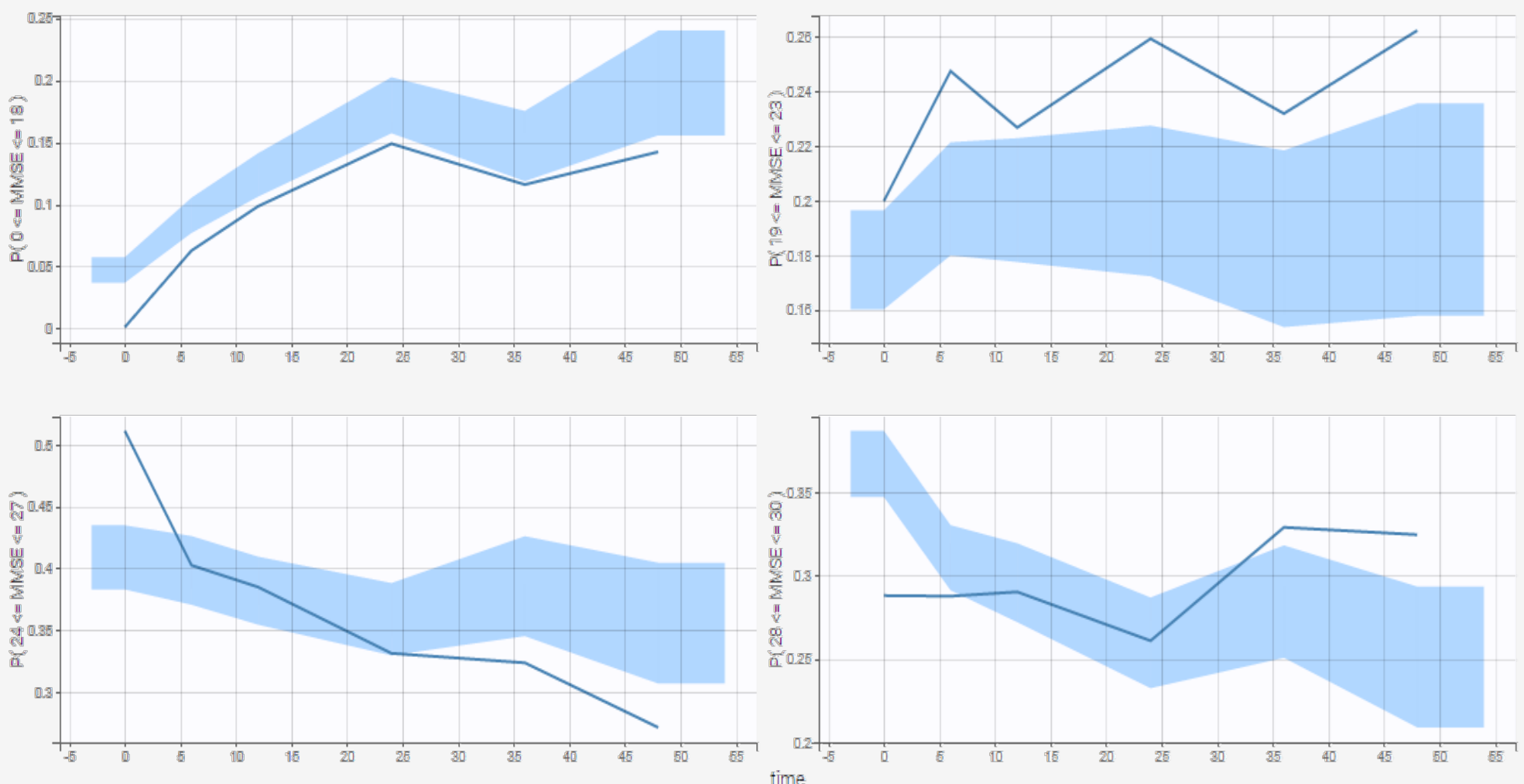
Covariate search was performed using the SCM and COSSAC methods. The following covariates appear as predictive:

	p0	alpha
AGE	✓	✓
APOE (0,1 or 2)	✓	✓
Cog. Function (CN, MCI or AD)	✓	✓
BMI		✓
WT		
HT		
SEX		
RACE		

The estimated parameter values and RSE are:

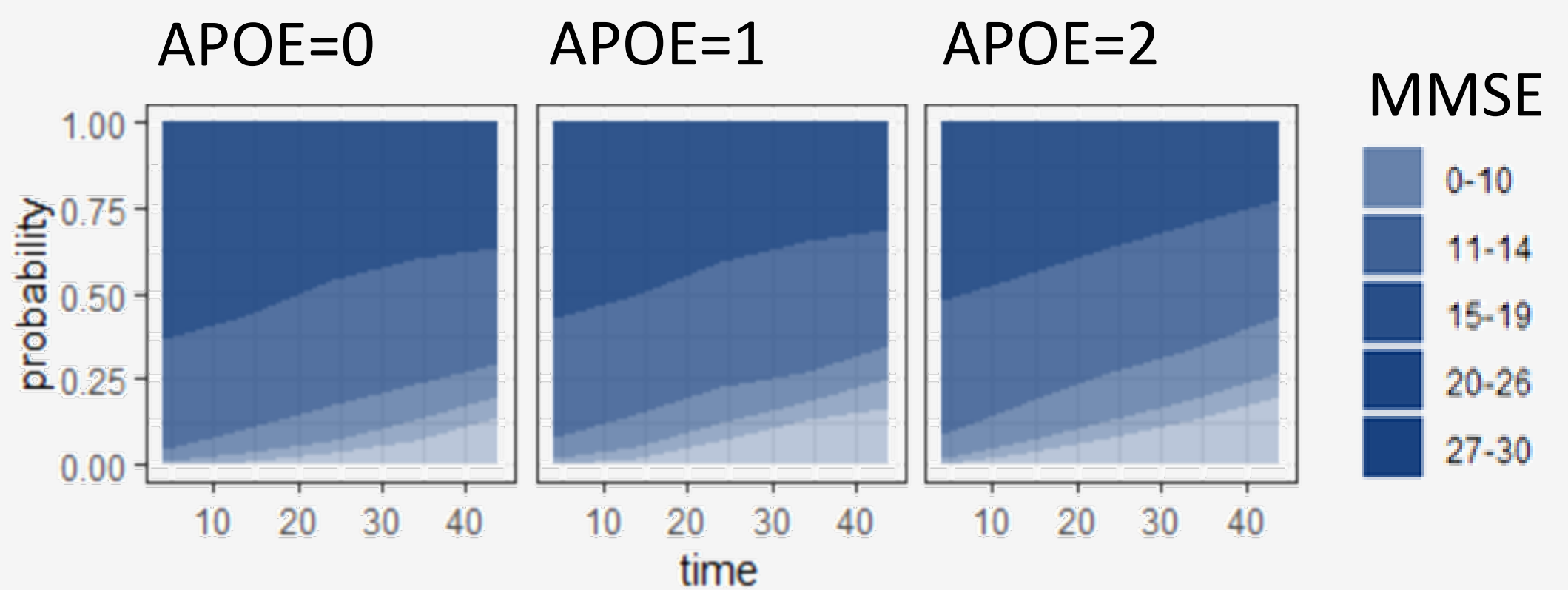
	VALUE	RSE (%)
Fixed Effects		
p0_pop	0.924	0.288
beta_p0_APOE_1	-0.173	24.8
beta_p0_APOE_2	-0.211	27.8
beta_p0_logAGE	-0.841	31.6
beta_p0_tARM_G_2	-1.11	4.08
alpha_pop	0.0131	8.68
beta_alpha_APOE_1	0.251	34.5
beta_alpha_APOE_2	0.368	31.3
beta_alpha_logAGE	-1.16	38.2
beta_alpha_logBMI	-0.879	33.4
beta_alpha_tARM_G_2	0.409	21.7
Standard Deviation of the Random Effects		
omega_p0	0.548	3.4
omega_alpha	0.786	5.83
Correlations		
corr_p0_alpha	-0.079	6.8

The model captures the main trend of the data:



SIMULATIONS

The disease progression model can be used to simulate the disease progression of new populations with Simulx. Below we compare the progression of a population with 0, 1 or 2 APOE alleles.



REFERENCES

[1] Alzheimer’s Disease Neuroimaging Initiative (ADNI) database (adni.loni.usc.edu).

