# Can predicting data improve model interpretation and inferences? Using Stan to fight the assumption of independence.

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# Goal:

model interpretation with highly correlated predictors

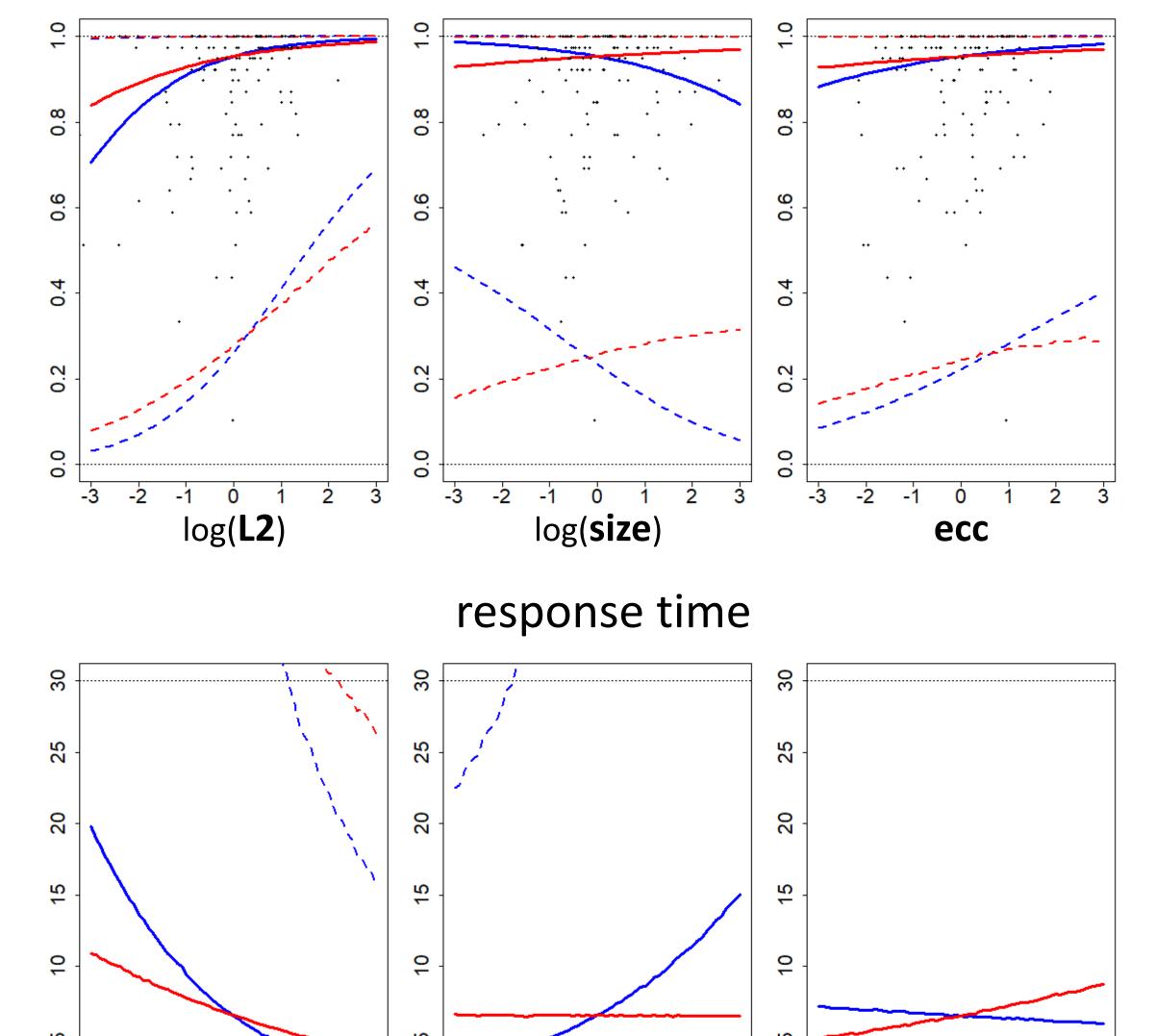
## **Dataset:**

- cognitive psychology experiment
- participants asked to indicate, whether are two interchanging images the same
- 40 participants

# Interpreting the results with partial dependence plots

- estimating the grand mean and expected range for 95% of future observations
- classical partial dependence plots in blue
- partial dependence plots accounting for correlation in red





## 128 pairs of images belonging to 8 categories

- trial features:
  - **size** of the change
  - eccentricity of the change
  - measure of disimilarity of the two images in CNN using L2

0.78

0.21

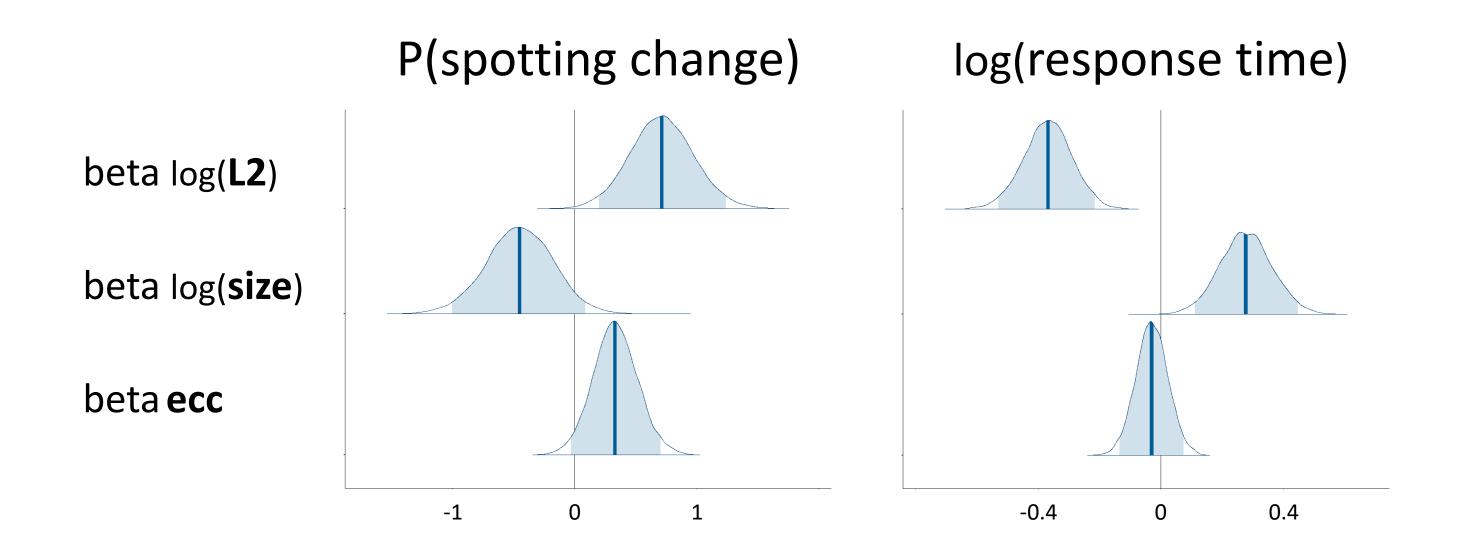
0.30

ecc



# Models:

- two hierarchical models in Stan
- logistic regression for the probability of spotting the change
- linear regression with censoring for the response times



Paradox: the larger the size of the change, the lower the probability of spotting it and the longer the response times?





**Construction of the partial dependence plots** accounting for correlation between predictors

- 1) select a range of values for the predictor of interest
- estimate expected values of the other predictors in the 2) selected range

log(size)

ecc

3) input the values of the predictor of interest and estimated values of the other predictors to the model for the response variable

## Summary:

-2 -1

log(**L2**)

- Effects of correlated predictors are often hard to interpret
- We propose a solution how to contruct partial dependence plots accounting for the correlation
- Contribution of each predictor is easier to understand and  $\bullet$ the method facilitates more accurate interpretation of results

## Interested in the models?

Check them out in the ShinyStan application!

#### http://bit.ly/stan models



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What is the impact of different correlations between predictors on partial dependence plots? Try it yourself in the interactive Shiny application!

### http://bit.ly/predicting data



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