

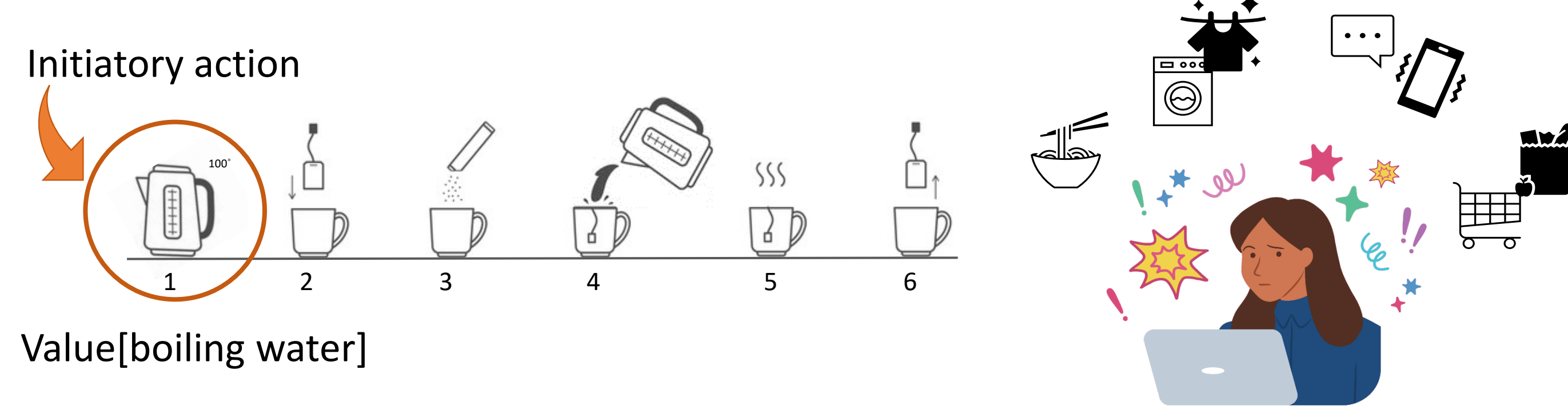
# Attenuated sensitivity to action-values explains inconsistent behavior in ADHD in outcome-distant states

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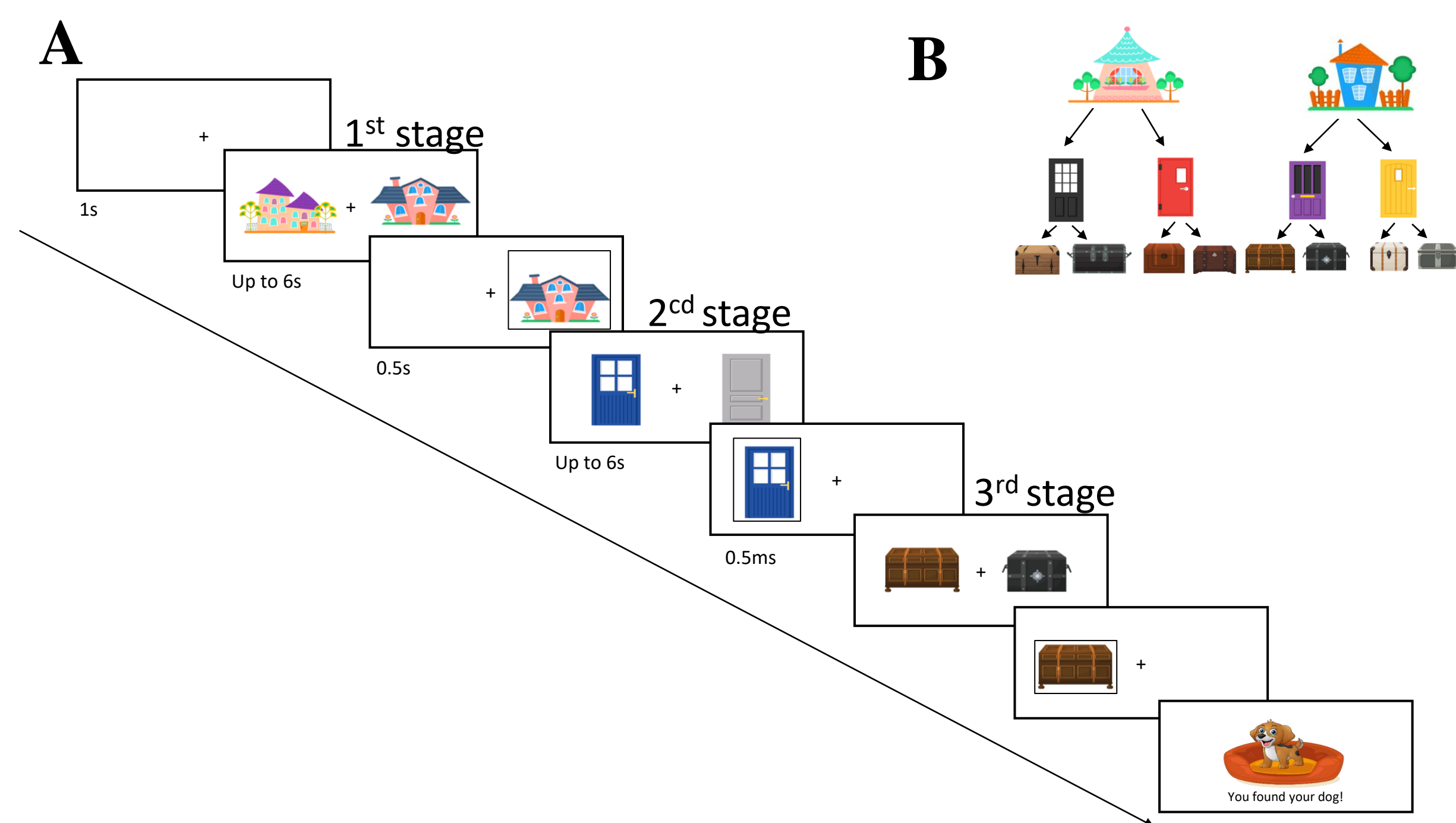
## BACKGROUND

Individuals with ADHD are known to show difficulties in completing everyday tasks. This work examines the value-based mechanism that might underlay ADHDs' difficulty to complete a series of actions required to achieve a goal.



## METHOD

In a clinical study 54 (28 ADHD, 26 HC) participants performed a sequential decision task (Figure 1). Clinical diagnosis was confirmed using a dedicated interview (DIVA-5<sup>1</sup>). Each trial participants were asked to make three actions in order to gain reward ("find the puppy").

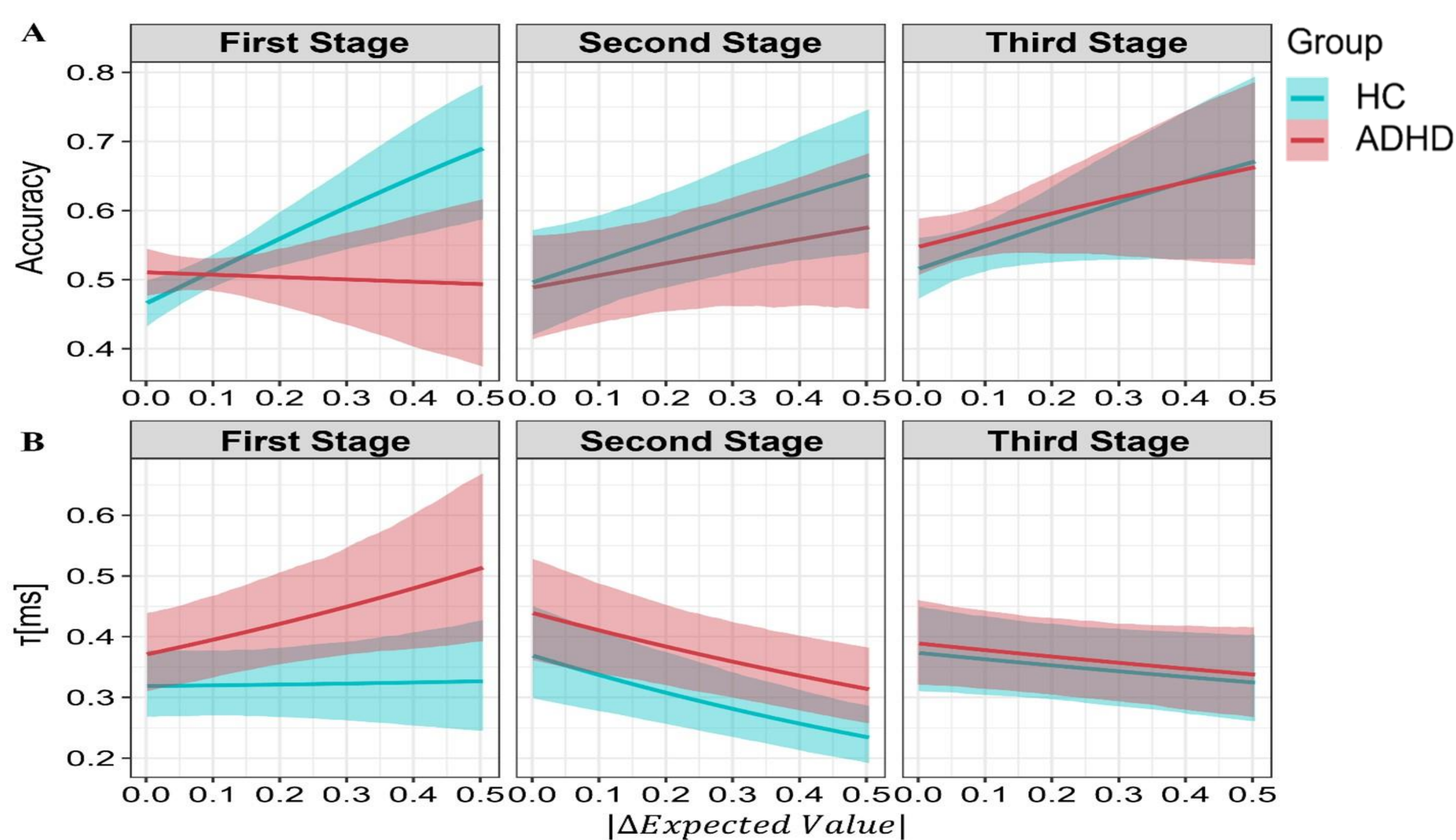


**Figure 1. Sequential decision task.** (A) Trial sequence where individuals made three choices to gain reward (finding a hiding puppy). (B) State-action transition structure.

## RESULTS

**Accuracy rates.** Hierarchical Bayesian regression of Group (HC or ADHD) X Stage (I, II or III) X expected-value differences (defined as the delta between the maximal expected values of every two presented choices, i.e.,  $|\Delta EV|$ ) showed a substantial group difference for Stage I X  $|\Delta EV|$  that disappears on Stage II on Stage III (Figure 2A).

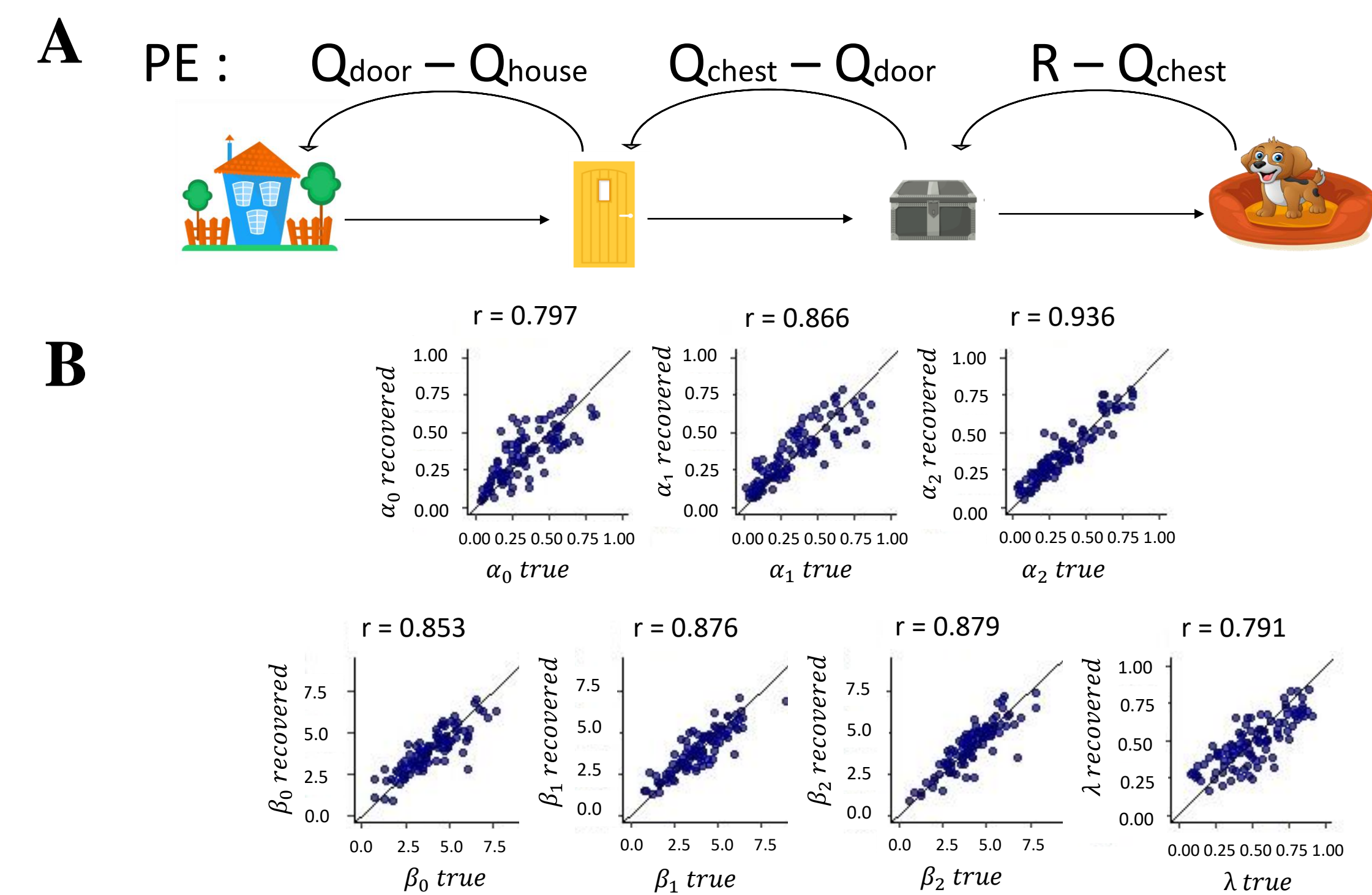
**Reaction time variability.** We estimated the effect of Group (HC or ADHD) and Stage (I, II or III) on reaction-time variability (RTV), tau parameter in an ex-Gaussian distribution. We found RTV group differences at the 1st and 2nd stage, but not the 3rd (Figure 2B).



**Figure 2. Accuracy and RTV.**

**Computational modeling and estimation of internal action value.** Here, we sought to estimate the internal action value in action-outcome sequences using the eligibility-trace model (Figure 3A).

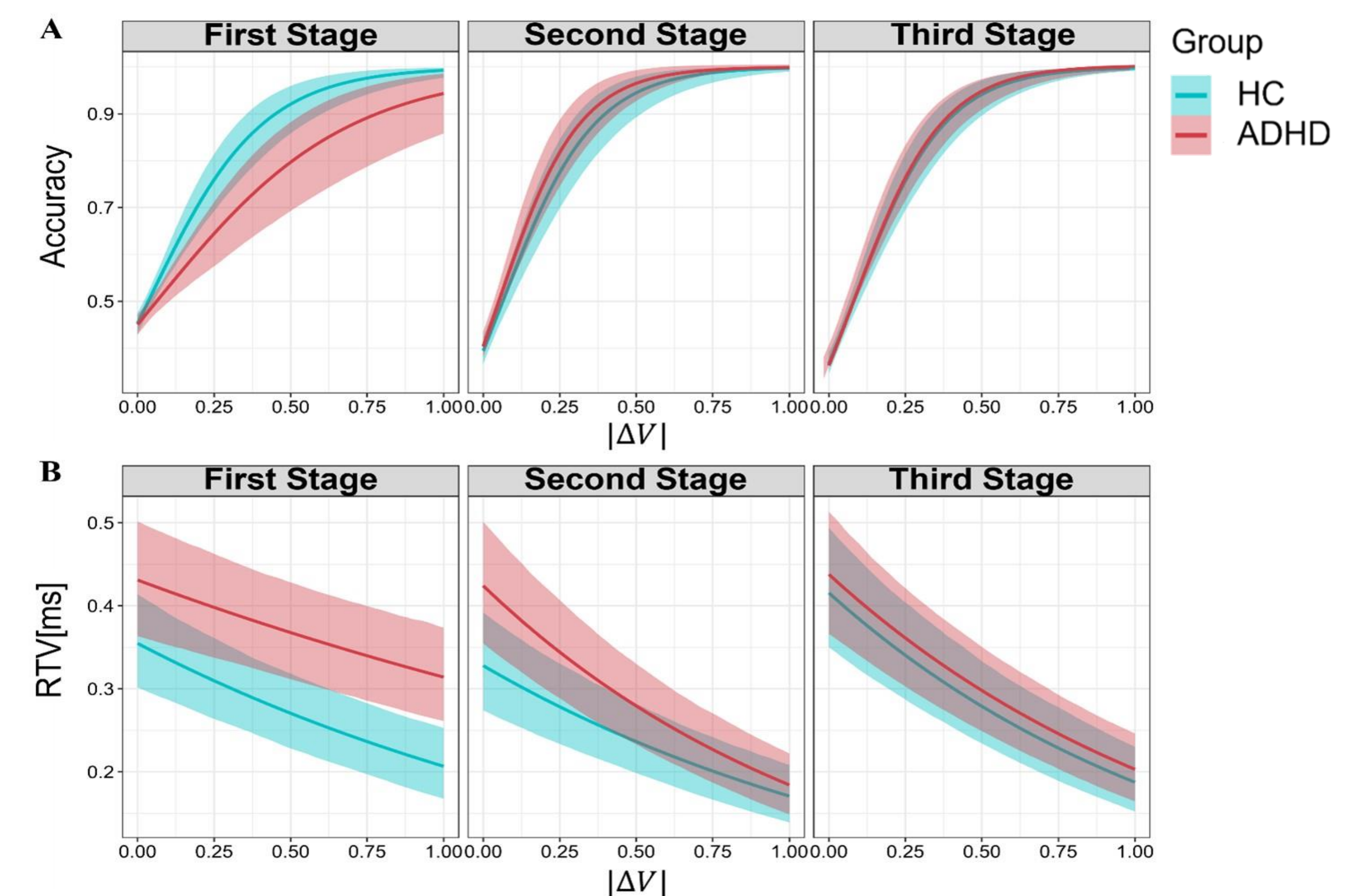
First, using simulated data of the eligibility-trace model<sup>2</sup>, we showed it is recoverable, so that we were able to extract and recover the predefined latent parameters (Figure 3B). Next, we fitted the eligibility-trace model to the behavioral data to estimate the participants' internal action value.



**Figure 3. Eligibility-trace model and parameter recovery.**

## Estimating choice accuracy and RTV according to internal action values.

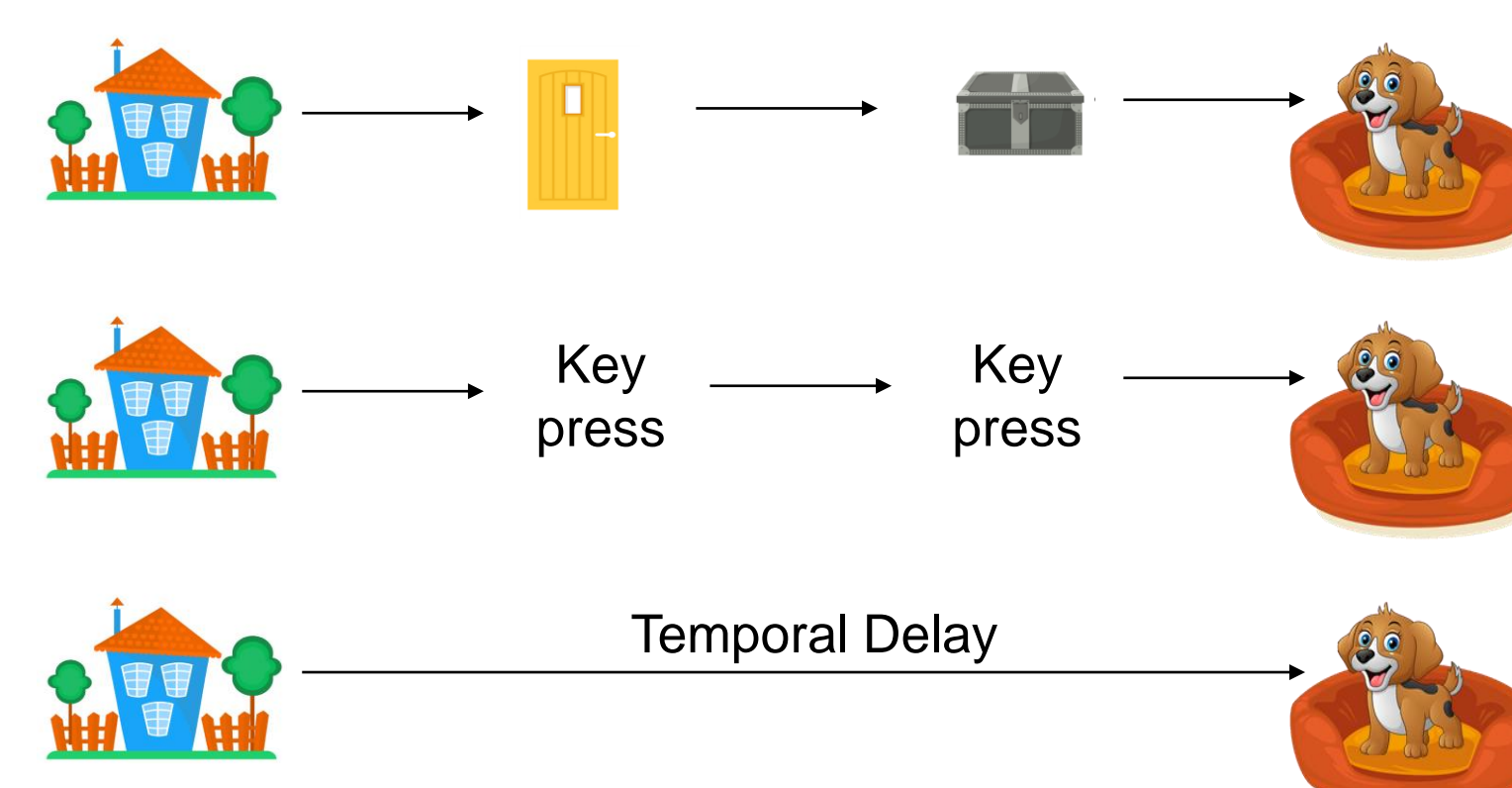
Two analysis (logistic regression and Ex-Gaussian) of absolute difference in internal action value (i.e.,  $|\Delta Q|$ ), Group (HC or ADHD) and their paired interaction as predictors for internal choice accuracy or the tau parameter in an ex-Gaussian distribution showed a substantial group x difference in internal action value interaction for Stage I but not for Stage II nor Stage III (Figure 4).



**Figure 4. Internal accuracy and RTV as a function of internal action values**

## DISCUSSION

In the present study, we demonstrated an ADHD deficit to act upon action-outcome associations across different stages of a sequential reinforcement learning task. This experimental design allowed us to explore the value-based mechanism underlying inconsistent behavior of actions coupled with outcome-distance, as well as to examine the extent to which internal action-values and outcome proximity moderate such inconsistent behavior.



## References

- Kooij J. J. S., Francken M. H., Bron T. I., McCarthy J., Perera B. D. Diagnostic Interview for ADHD in Adults With Intellectual Disability (DIVA-5-ID) Journal of Mental Health Research in Intellectual Disabilities. 2017;10(1):64-65. doi: 10.1080/19315864.2017.1368259.
- Sutton, R. S., & Barto, A. G. (1998). Reinforcement learning: An introduction. MIT press.