

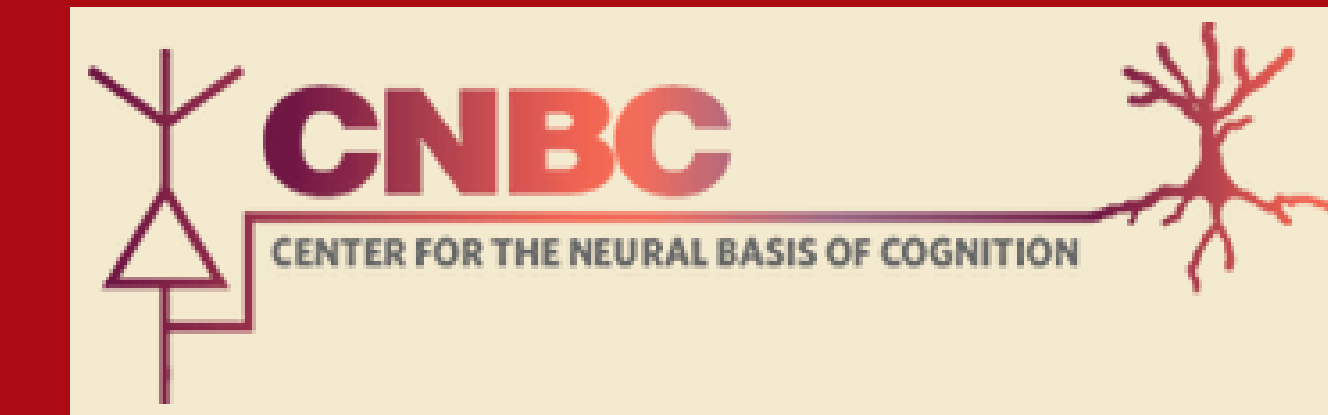
# Highway from the Danger Zone: Interactions between uncertainty and cost in spatial estimation

Kevin Jarbo<sup>1</sup> ([kjarbo@andrew.cmu.edu](mailto:kjarbo@andrew.cmu.edu)), Rory Flemming<sup>2</sup> & Timothy Verstynen<sup>1</sup>

<sup>1</sup> Dept of Psychology & Center for the Neural Basis of Cognition  
Carnegie Mellon University

<sup>2</sup> University of Pittsburgh

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## Background

Costs are incorporated during the spatial estimation and selection of a target stimulus (Wu, Delgado & Maloney, 2009). As spatial variability (i.e., sensory uncertainty) of target stimuli increases, selection variability also increases (van Beers, Baraduc & Wolpert, 2002). Furthermore, selections are biased away from optimal estimations when a penalizing distractor is simultaneously presented with a target (Landy, Trommershäuser & Daw, 2012). While spatial variability and reinforcement signals affect target estimations, it is unclear what influence sensory uncertainty may have on cost calculations during spatial sensorimotor decisions.

## Hypotheses

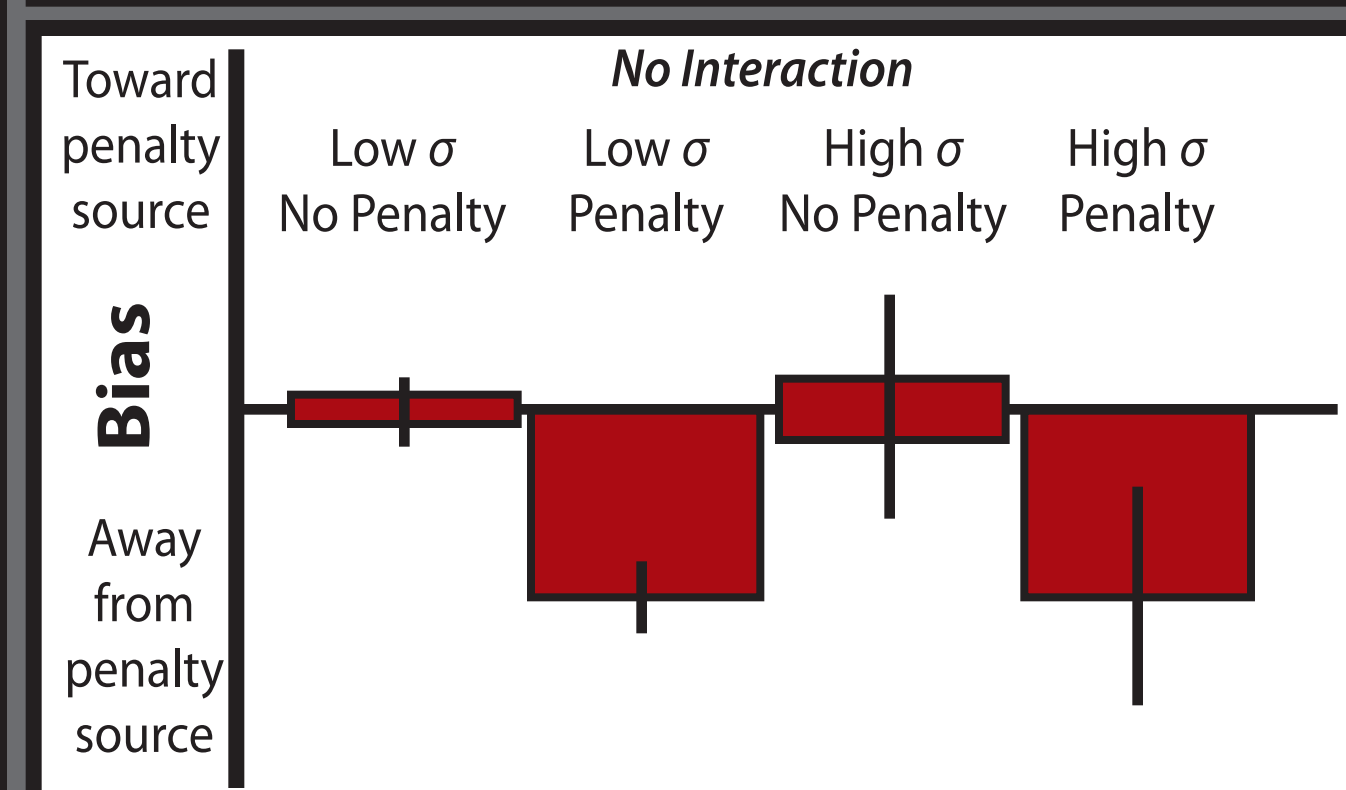
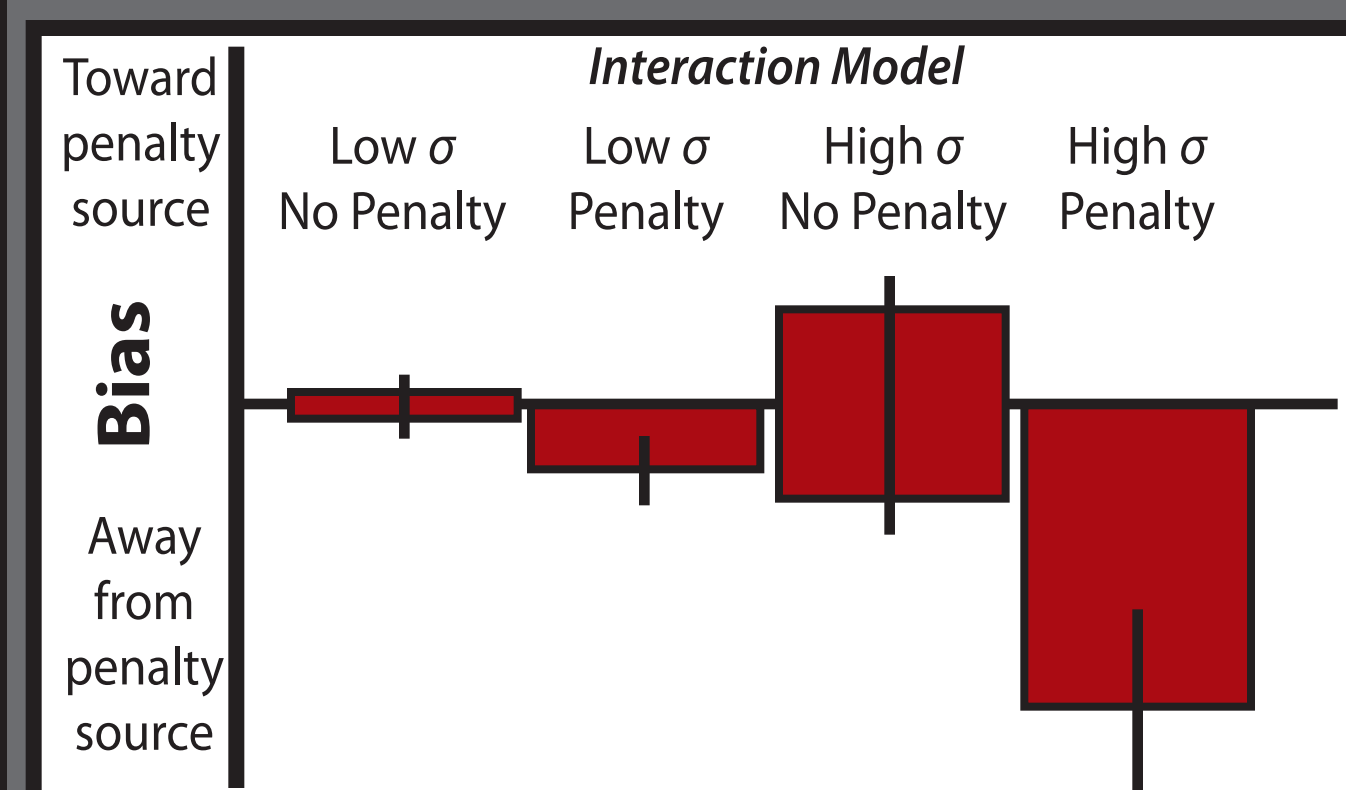
If sensory uncertainty influences cost calculations during spatial sensorimotor decisions, then...

1) Estimation variance should be greater for high variability (i.e., high sensory uncertainty) targets

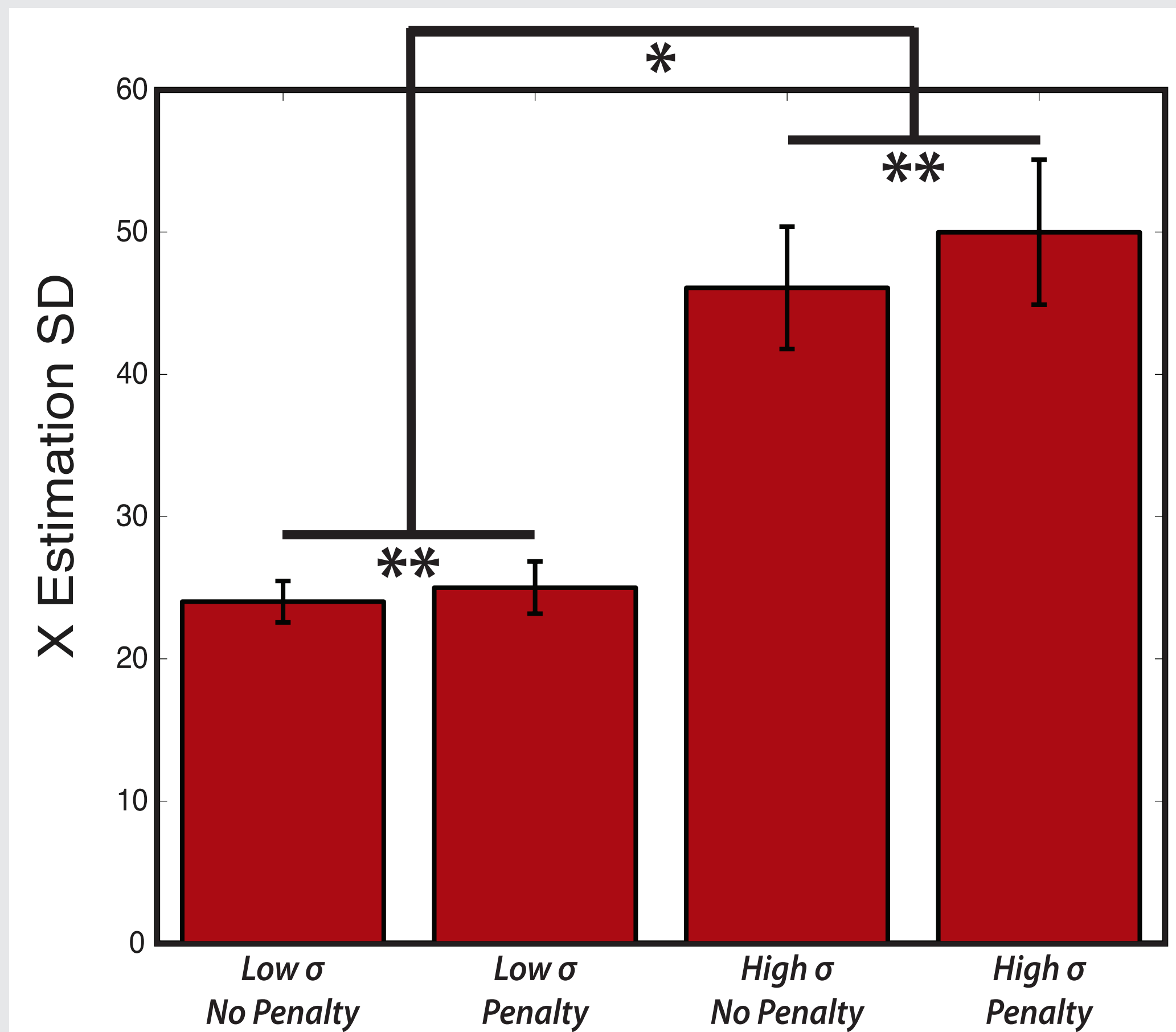
2) Estimations should be biased away from penalty sources

3) High sensory uncertainty and penalty should interact to strongly bias estimations

Alternatively, if there is no interaction, then there should be no significant difference in bias between penalty conditions



## High sensory uncertainty & penalty increase estimation variance



2-way ANOVA	F (1, 22)	p
Variance	57.4895	*1.4214 x 10 <sup>-7</sup>
Penalty	12.5254	**0.0018
Variance by Penalty	0.64	(ns) 0.4323

Paired t Test	t (22)	p
Low $\sigma$ /No Penalty vs. Low $\sigma$ /Penalty	-2.0985	**0.0238
Low $\sigma$ /No Penalty vs. High $\sigma$ /No Penalty	-8.7607	* < 0.00005
Low $\sigma$ /Penalty vs. High $\sigma$ /Penalty	-6.0938	* < 0.00005
High $\sigma$ /No Penalty vs. High $\sigma$ /Penalty	-1.9663	**0.0310

## Results

### Estimation Variance (Left)

Significant main effects of target Variance & Penalty on estimation variability

Nonsignificant Variance by Penalty interaction

Greater estimation precision in low variance or no penalty conditions

### Estimation Bias (Right)

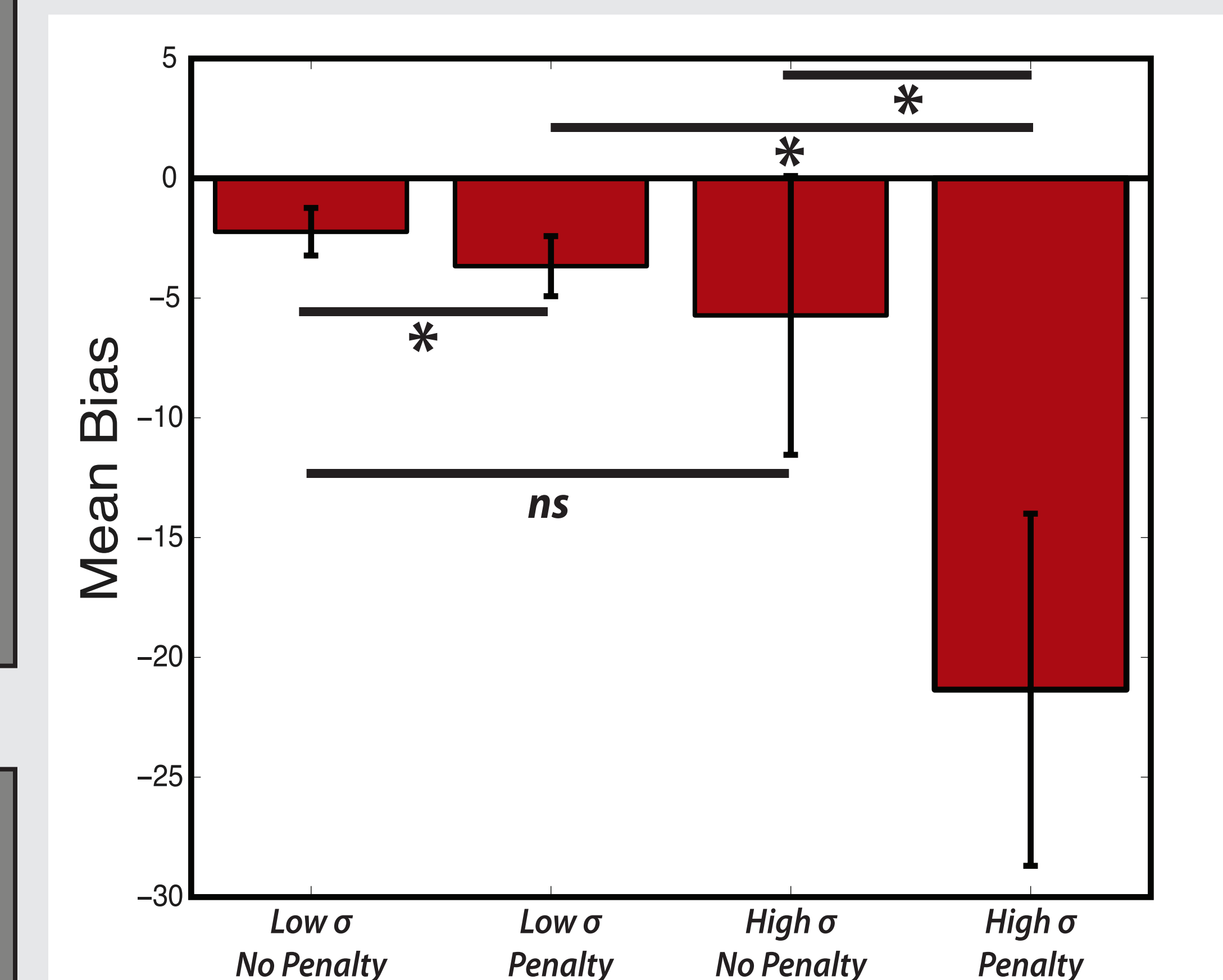
Nonzero bias away from Danger Zone

Penalty significantly biases estimation within conditions

Significant Variance by Penalty interaction in High  $\sigma$  condition

High variance strongly bolsters penalty

## Sensory uncertainty & penalty interact to strongly bias estimation



2-way ANOVA	F (1, 22)	p
Variance	6.4371	*0.0188
Penalty	7.0876	*0.0142
Variance by Penalty	4.3607	*0.0486

Paired t Test	t (22)	p
Low $\sigma$ /No Penalty vs. Low $\sigma$ /Penalty	2.0423	*0.0266
Low $\sigma$ /No Penalty vs. High $\sigma$ /No Penalty	0.8433	(ns) 0.2041
Low $\sigma$ /Penalty vs. High $\sigma$ /Penalty	3.003	*0.0033
High $\sigma$ /No Penalty vs. High $\sigma$ /Penalty	2.3845	*0.0131

## Methods

### Participants

23 Carnegie Mellon University undergraduates (10 F, 13 M), mean age = 19.6 years  
CMU IRB-approved consent

### Design & Analyses

2 x 2 (Low  $\sigma$ /High  $\sigma$  x No Penalty/Penalty)  
4 conditions, within-subjects  
Low  $\sigma$ /No Penalty, Low  $\sigma$ /Penalty  
High  $\sigma$ /No Penalty, High  $\sigma$ /Penalty

8 blocks (random) x 100 self-paced trials  
80 estimation + 20 catch/block  
160 estimation trials/condition

### Independent Variables

Target Zone (TZ; white) - max score at true center  
100 points sampled from Gaussian distribution  
Random  $\mu$  location  
Low  $\sigma$  = 25, High  $\sigma$  = 100  
Danger Zone (DZ; red) - max penalty at true center  
100 points sampled from Gaussian distribution  
DZ  $\mu$  = TZ + 50 (along X-axis when right of TZ)  
DZ  $\mu$  = TZ - 50 (along X-axis when left of TZ)  
Constant  $\sigma$   
No Penalty = 0, Penalty = 0.67 x Reward

### Dependent Variables

X-coordinate estimation variance  
Bias = distance away from Danger Zone

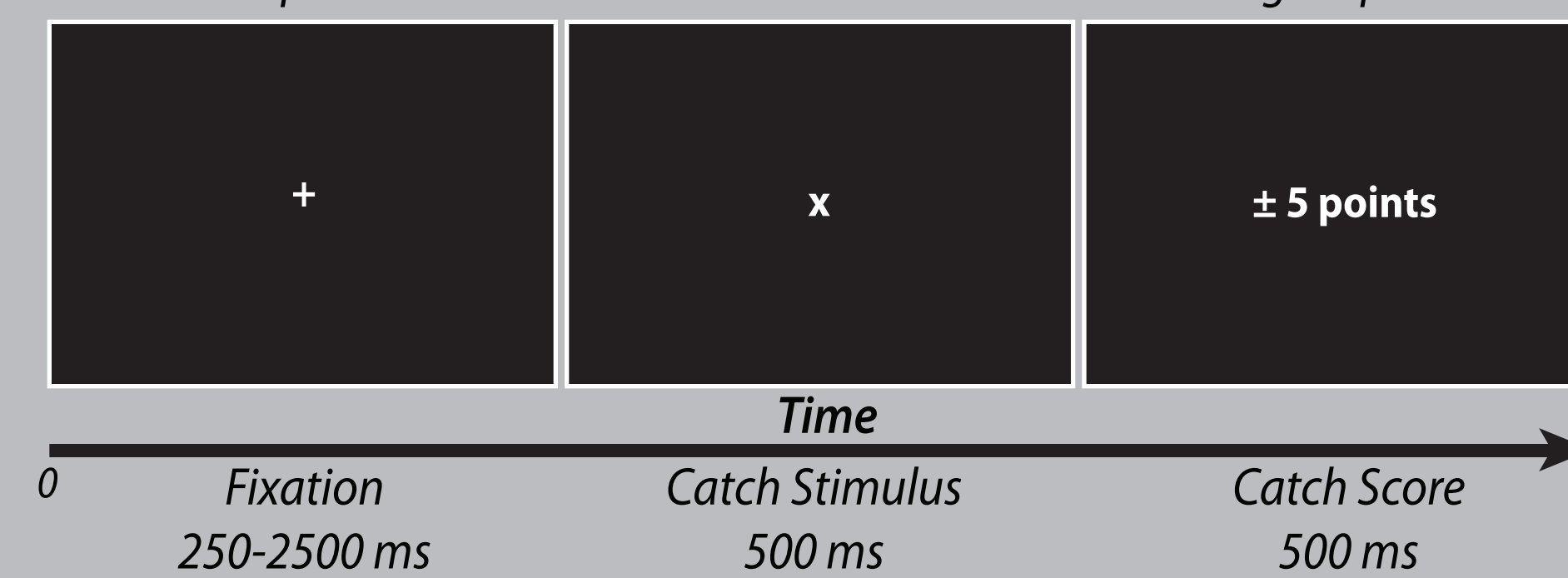
### 2-way ANOVA w/post-hoc paired t Tests

Low  $\sigma$ /No Penalty vs. Low  $\sigma$ /Penalty  
Low  $\sigma$ /Penalty vs. High  $\sigma$ /Penalty  
High  $\sigma$ /No Penalty vs. High  $\sigma$ /Penalty

### Stimulus Presentation

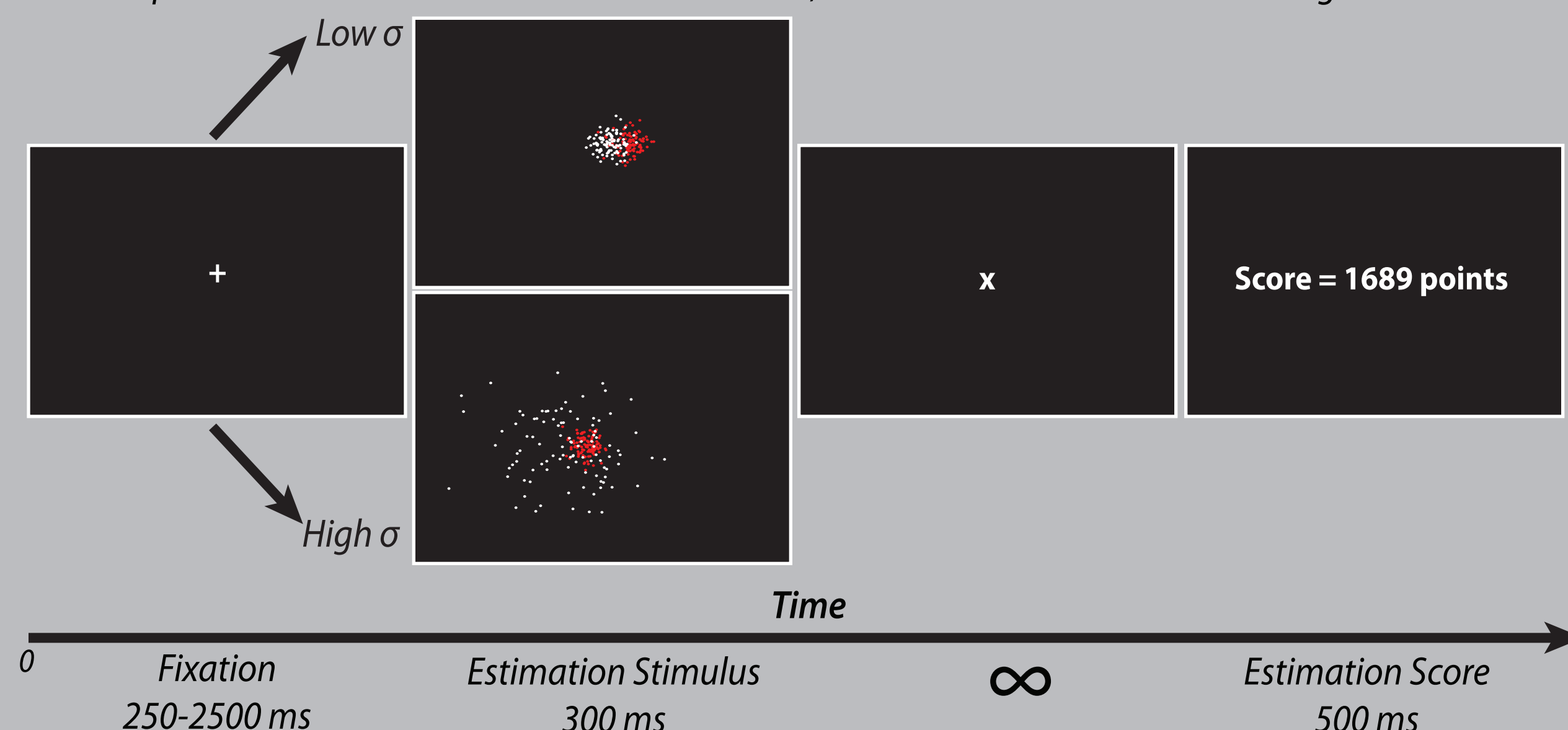
#### Catch Trial

Participant must release mouse button within 500 ms to gain points



#### Estimation Trial

Participant initiates trial with mouse click-and-hold, and indicates estimation with drag-and-release



### Reward & Penalty Scaling

#### Euclidean distance of Estimation from TZ & DZ

$$TZ_{Dist} = \sqrt{\sum ((x,y)_{Est,est} - (x,y)_{TZ})^2} \quad DZ_{Dist} = \sqrt{\sum ((x,y)_{Est,est} - (x,y)_{DZ})^2}$$

#### Raw scores computed from distances

$$EstBonus_{NoPenalty} = \frac{100}{TZ_{Dist}} \quad EstPenalty_{Penalty} = \frac{100}{DZ_{Dist}}$$

#### Total Score computed from scaled raw scores

$$Score_{total} = (0.33 * EstBonus_{NoPenalty}) - (0.67 * EstPenalty_{Penalty})$$

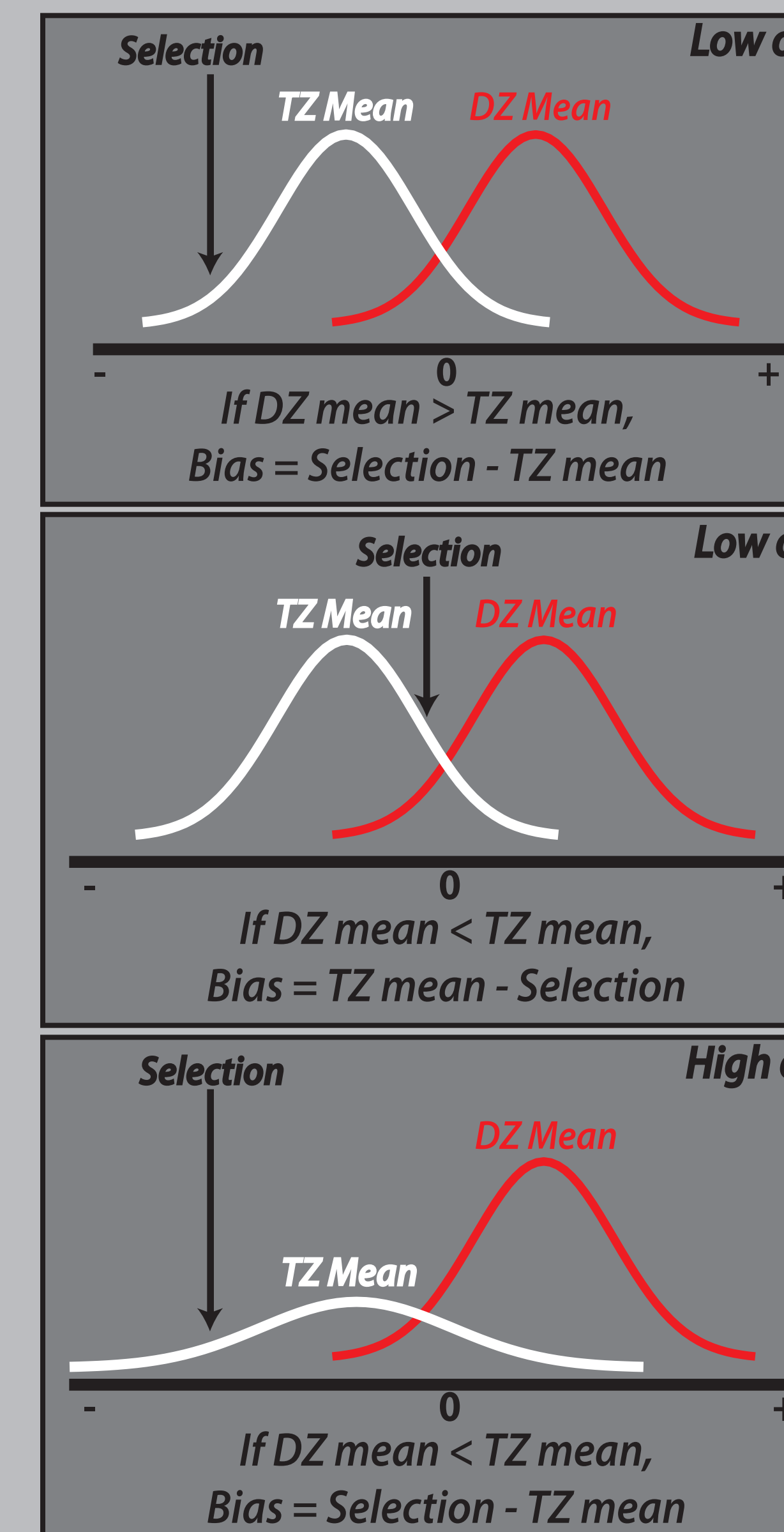
Scaled penalty calculated only in Penalty condition

Seriously. Call Kenny Loggins...



...cause you're in the Danger Zone!!!

### Bias Calculations



## Summary

High sensory uncertainty increases spatial selection variance  
Spatial selections are biased away from distractors  
Penalty signals interact with high and low sensory uncertainty to bias selections

## Conclusion

Sensory variance influences cost calculations during spatial estimation

## References

- Wu, S.-W., Delgado, M. R., & Maloney, L. T. (2009). Economic decision-making compared with an equivalent motor task. *Proceedings of the National Academy of Sciences of the United States of America*, 106(15), 6088–93.
- van Beers, R. J., Baraduc, P., & Wolpert, D. M. (2002). Role of uncertainty in sensorimotor control. *Phil. Trans. R. Soc. Lond. B*, 357, 1137–1145.
- Landy, M. S., Trommershäuser, J., & Daw, N. D. (2012). Dynamic estimation of task-relevant variance in movement under risk. *The Journal of Neuroscience*, 32(37), 12702–11.