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Neural Mechanisms Underlying the Impact of Pavlovian Observational Learning on Decision Making

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46 instrumental threat avoidance at the behavioral and47 neural level.

Abstract

Increasingly, modern humans encounter threats48 10 indirectly, through social networks and media, affecting their behavior significantly which can⁴⁹ 11 12 increase anxiety and affect subsequent decision⁵⁰ 13 making. However, the underlying neural mechanisms⁵¹ 14 how⁵² study investigates 15 are unclear. This observational threat learning shapes instrumental $^{53}\,$ 16 decision-making (threat avoidance learning) and its 54 17 neural basis. During neuroimaging 44 participants⁵⁵ 18 which 5619 experiencing threats, observed others learning,⁵⁷ 20 enhanced subsequent instrumental Pavlovian cues⁵⁸ 21 especially when observational aligned with instrumental outcomes—an effect⁵⁹ 22 learning.⁶⁰ 23 absent without observational arbitration⁶¹ 24 Computational modeling indicated between observational Pavlovian and instrumental⁶² 25 values. Neuroimaging revealed that periaqueductal 63 26 gray (PAG) activity correlated with observational⁶⁴ 27 aversive prediction errors, which in turn affected⁶⁵ 28 subsequent decision-making. These findings suggest⁶⁶ 29 that the PAG plays a critical role when socially⁶⁷ 30 acquired threat information shapes instrumental 68 31 69 32 threat avoidance. 70

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Introduction

Modern humans increasingly learn about fear 75 36 eliciting events (e.g., terrorist attacks) in a second-hand 76 37 fashion, through social networks and mass media, and 77 38 39 adjust behavior based on vicarious experience (Neria &78 40 Sullivan, 2011). Such observational threat learning can79 41 facilitate or impede subsequent decisions aiming to avoid 80 threat (Lindstrom et al., 2019). The underlying neural 81 42 mechanisms remain to be investigated. In this study, we 82 used neuroimaging and investigated how Pavlovian 43 44 observational threat learning impacts subsequent 45

Methods

We scanned 44 participants in an Experimental and a Control condition. In the Experimental condition. Social Threat conditioning preceded Decision-Making (Figure 1). Social Threat conditioning consisted of Pavlovian observational threat learning where participants watched videos in which a demonstrator was probabilistically subjected to electric shocks after one conditioned stimulus (CS+), while another stimulus (CS-) was not followed by shock. Next, they performed an instrumental threat avoidance task (Decision-Making), where they instrumentally learned associations between the previously observed stimuli and an aversive outcome (i.e., electric shock) for themselves.

The Decision-Making part was further divided into a Congruent (n=22 participants -No Change groupexperienced this phase in the initial Transfer block) and an Incongruent phase. In the Congruent phase, the previously observed CS+ was associated with a higher probability of shock than the previously observed CS-, such that Pavlovian and instrumental learning were aligned. In the Incongruent phase (the other n=22 participants -Change group- experienced this phase in the initial Transfer block), the previously observed CSwas associated with a higher probability of shock than the previously observed CS+, such that Pavlovian and instrumental learning were misaligned. Regardless of which phase was experienced first, they were reversed halfway through the Decision-Making part (Reversal block).

In the Control condition, the structure of the Decision Making part was identical, but not preceded by observational threat learning. Instead, participants were exposed to the two stimuli as often as in the Experimental condition prior to the Decision-Making part. This allowed

us to compare instrumental learning with and without 27 Figures 83 84 previous observational threat learning.

Results 85

86 Behavioral: We found that Pavlovian observational threat 87 learning affected subsequent instrumental threat learning 88 (Figure 3). In the Experimental condition, instrumental

89 learning performance in the Congruent phase was higher

90 than in the Incongruent phase during the Transfer block,

- but this difference diminished during the Reversal block 91
- (Congruent/Incongruent x Transfer/Reversal: Z=3.47¹²⁰ 92
- p=0.001). By contrast, this pattern was not found in the 13093 94
- Control condition (Z=-.22, p=0.63). Thus, prior Pavlovian
- 95 observational threat learning preferentially affected the 96 initial Transfer phase of subsequent instrumental threat
- 97 avoidance learning.

98 Computational modelling: The computational model 99 (Figure 2) combined Pavlovian observational threat 100 learning and instrumental learning. It assumes that the two forms of learning are arbitrated by weight (ω) and 31 101 thereby commonly affect decision making. This model 32 102 103 explained behavior well, and better than alternative 33 104 models using only instrumental learning($\Delta DL = 58$).

105 Neuroimaging: Prediction errors during Social Threat 106 conditioning correlated with periaqueductal gray (PAG) 107 activity (Figure 4). Importantly, this activity was 108 associated with the weight given to Pavlovian versus instrumental values during Decision Making (r = 0.429, p 109 110 < 0.01): the more sensitive PAG activity was to aversive

111 prediction errors during observational threat learning, the

112 more strongly Pavlovian values affected subsequent 34 instrumental threat learning. Together, these finding\$35 113 114 suggest that the PAG is centrally involved in the social 36 115 learning of threat and the subsequent use of the learned 37

116 information for threat avoidance decisions.

117 Conclusion

118 We demonstrate that observational aversive 119 learning impacts subsequent decision making. At the neural level, PAG activity encodes observational aversive 120 prediction errors and the extent to which Pavlovian values 121 influence subsequent instrumental threat avoidance 122

learning. Our data suggest that PAG activity plays an 141 123 important role in the transfer of observational threat t_0^{41} 124 125 instrumental decision making.

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Figure 1: Experimental condition (Social Threat learning precedes Decision Making).





Competing Systems - model



Figure 3. Computational model, where weight (ω) determines relative contribution of Pavlovian values to instrumental learning.



Figure 4. PAG activity associated with negative signed observational threat prediction errors during Social Threat Learning and correlated with weight (ω) parameter during Decision Making.

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