1	Mid-level arousal facilitates optimal behavioral state in humans and mice		
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28	Abstract	52	al., 2021) or alternates quickly between discrete
29	Perceptual choice behavior alternates	53	strategies (Ashwood et al., 2022; Bolkan et al.,
30	between discrete strategies, which can be	54	2022; Hulsey et al., 2024; Weilnhammer et al.,
31	identified through hidden Markov modeling.	55	2023). For example, experimental trials can be
32	Peak performance occurs during mid-level	56	clustered in states of engaged, disengaged, and
33	pupil-linked arousal. Here, we (i) replicated the	57	blased decision-making strategies, and these
34	previously observed "inverted-U" relationship	00 59	deneralized linear hidden Markov models (GLM-
35	and engaged state occurrence (Hulsov et al	60	HMMs) (Ashwood et al., 2022: Hulsev et al.,
37	2024). (ii) confirmed the model-based	61	2024).
38	prediction that this relationship is mediated by	62	Arousal, driven by the activity of globally
39	GABAergic interneurons and (iii) established	63	projecting subcortical neuromodulatory systems,
40	that this relationship generalizes to humans.	64	may be an important predictor of engaged states.
41	We conclude that arousal dynamically	65	By changing the functional properties of their
42	modulates the cortical state of a sensory	60 67	target networks, neuromodulatory systems are in
43	region to optimize perceptual decision-	68	activity underlying decision-making in a
44 45	ilianily.	69	coordinated fashion (Aston-Jones & Cohen.
46	Keywords: Perceptual decision making.	70	2005). Baseline pupil size, which reflects the tonic
47	hidden Markov modeling, pupil, arousal.	71	activity of multiple neuromodulatory systems (de
48	- · ·	72	Gee et al., 2017; Joshi & Gold, 2020) and the
49	Introduction	73	ensuing cortical arousal state (McGinley, Vinck, et
50	Perceptual choice behavior is typically not	/4 75	al., 2015), indeed predicts optimal perceptual
51	stationary but instead evolves gradually (Pov et	15	sensitivity during medium baseline pupil-linked

50 Perceptual choice behavior is typically not 51 stationary but instead evolves gradually (Roy et

76 arousal, and lower sensitivity during low and high

arousal (Beerendonk et al., 2024; de Gee et al.,
2024; McGinley, David, et al., 2015). The same
"inverted-U" relationship was recently observed
between the probability of being an engage state
and baseline pupil-linked arousal (Hulsey et al.,
2024).

83 Here, we aimed to (i) replicate the previously observed "inverted-U" relationship 84 between baseline pupil-linked arousal in mice and 85 engaged state occurrence (Hulsey et al., 2024), (ii) 86 the model-based prediction that this 87 test mediated relationship is by GABAergic 88 interneurons (Beerendonk et al., 2024) and (iii) 89 test if this relationship generalizes to humans. 90

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Methods

The current study analyzed behavioral, pupil, and 93 neural data from mice (N=9; audio-visual change 94 detection task) and humans (N=69; auditory 95 detection task; no neural data) (Fig. 1A). GLM-96 97 HMMs were fitted to choice behavior data to identify persistent behavioral states with distinct 98 99 decision-making strategies. The relation between engaged state probability and baseline pupil-100 101 linked arousal was assessed with second-order polynomial regression models in mice and 102 humans. For mice, spiking activity of V1 103

GABAergic interneurons and putative pyramidal
neurons was recorded. A mediation analysis was
used to investigate if the relation between baseline
arousal and engaged state probability was
governed by the baseline firing rate of these
distinct neuron types.

Results

Mice and humans alternated between several 112 discrete behavioral states (Fig 1B,C). Engaged 113 behavioral state probability exhibited an inverted-U 114 relationship with baseline pupil-linked arousal (Fig. 115 116 2). In mice, preliminary neural analyses further suggest that for visual change detection, this 117 relationship was mediated by pre-change V1 firing 118 rates of putative GABAergic interneurons but not 119 120 putative pyramidal neurons.

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Discussion

These findings imply a general mechanism by 123 124 which arousal dynamically modulates the cortical 125 state of a primary sensory region to optimize 126 perceptual decision-making. This study furthermore highlights an important insight for 127 128 consciousness research: conscious perception is governed by discrete and persistent states of 129 130 altered sensory processing



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Figure 1. (A) Schematic of audio-visual change detection task performed by mice (N=9), and of yes/no
 auditory detection task performed by human subjects (N=69). (B) Example session showing alterations
 between discrete decision strategies. (C) Average psychometric fit across subjects for each behavioral
 state. Shading, S.E.M. across subjects.

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Figure 2. (A) Average pupil response around the time of a stimulus change. Grey window indicates the 143 time window used for calculating baseline pupil. (B) Relation between baseline pupil size and optimal 144 145 state probability. Optimal state probability is non-linearly predicted by baseline pupil size, with the highest probability occurring at intermediate levels of baseline pupil-linked arousal. All panels: shading 146 147 or error bars. S.E.M. across subjects.

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