1 **TITLE** (< 120 characters)

2 Nucleus-accumbens dopamine tracks aversive-stimulus duration and prediction but not value

3 or prediction error

4 AUTHORS

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10 ABSTRACT (< 150 words)

- 11 There is active debate on the role of dopamine in processing aversive stimuli, where inferred roles
- 12 range from no involvement at all, to signaling an aversive-prediction error (APE). Here, we
- 13 systematically investigate dopamine release in the nucleus-accumbens core (NAC), which is closely
- 14 linked to reward-prediction errors, in rats exposed to white noise (WN, a versatile, underutilized,
- 15 aversive stimulus) and its predictive cues. Both induced a negative dopamine ramp, followed by slow
- 16 signal recovery upon stimulus cessation. In contrast to reward conditioning, this dopamine signal was
- 17 unaffected by WN value, context valence, or probabilistic contingencies, and the WN dopamine-
- 18 response shifted only partially towards its predictive cue. However, unpredicted WN provoked slower
- 19 post-stimulus signal recovery than predicted WN. Despite differing signal qualities, dopamine
- 20 responses to simultaneous presentation of rewarding and aversive stimuli were additive. Together,
- 21 our findings demonstrate that instead of an APE, NAC dopamine primarily tracks prediction and
- 22 duration of aversive events.
- 23

24 INTRODUCTION

- 25 The midbrain dopamine system plays critical roles in motivation, learning, and movement; specifically
- 26 for learning about rewards and creating motivational states that promote reward-seeking (Berridge &
- 27 Robinson, 1998; Bromberg-Martin et al., 2010; Berke 2018; Schultz, 2019). One of the most
- 28 prominent functions of dopamine is the encoding of a so-called reward prediction error (RPE) signal
- 29 (Schultz et al., 1997): When a reward is fully predicted by a cue, the increase in dopamine cell firing
- 30 and terminal release of dopamine shifts backwards in time from the moment of reward delivery, to that
- of the cue presentation (Schultz *et al.,* 1997; Flagel *et al.,* 2011). Furthermore, dopamine neurons
- 32 pause their firing when a predicted reward is omitted, and increase their firing in response to the

delivery of an unpredicted reward. Thus, dopamine neurons encode the difference between predicted
 and obtained reward, which is corroborated by the fact that dopamine-neuron activity scales with the
 relative value of reward and unexpected deviations from this value (Bromberg-Martin & Hikosaka,
 2009).

37 Although the vast majority of studies focus on the relationship between dopamine and stimuli 38 with a positive valence (rewards), the relevance of the dopamine system in processing stimuli with the 39 opposite valence (aversive) has also generated great interest. In contrast to the primarily stimulatory 40 response of rewards on dopamine activity, the reports on the effect of aversive events on the 41 dopamine system are less consistent. For example, on the level of dopamine-neuron cell-bodies. 42 aversive stimuli were demonstrated to result in inhibition of neuronal activity (Ungless et al., 2004; 43 Mileykocskiy & Morales, 2011), excitation thereof (Anstrom et al., 2009; Valenti et al., 2011), or no 44 effect at all (Mirenowicz & Schultz, 1996; Fiorillo, 2013). The widely-accepted explanation for these 45 varying results is that sub-populations of dopamine neurons exhibit different response profiles to 46 aversive stimuli (Schultz & Romo, 1987; Guarraci & Kapp, 1999; Coizet et al., 2006; Bromberg-Martin 47 & Hikosaka, 2009; Zweifel et al., 2011; Cohen et al., 2012; Lammel et al., 2011), whereby variance is 48 presumably introduced by different types of aversive stimuli, by the fact that some studies were 49 performed in awake and others in anesthetized animals, and by the location and projection targets of 50 the recorded dopamine neurons (Brischoux et al., 2009; Matsumoto & Hikosaka, 2009; Lammel et al., 51 2011). However, activity at the level of dopamine-neuron cell-bodies does not necessarily always 52 translate to their projection-targets (Mohebi et al., 2019), as axonal-terminal release of dopamine can 53 operate independently from cell-body activity (Threlfell et al., 2012). Therefore, in interrogating the 54 entire spectrum of functions of the dopamine system, it is imperative to include projection-target

55 measurements of extracellular dopamine concentrations.

56 Midbrain dopamine neurons modulate their targets via population signals: Dopamine release 57 from a large number of extra-synaptic terminals, combined, constitutes a diffusion-based signal that is 58 perpetuated by volume transmission (Rice & Cragg, 2008). The vast majority of projections from 59 dopaminergic neurons target the striatum and its subregions. Inconsistent with the classic hypothesis 60 positing that the dopamine system broadcasts a uniform signal across the striatum, it has been 61 reported multiple times in recent years, that dopamine signals display regional heterogeneity (Willuhn 62 et al., 2012, Willuhn et al., 2014a, Lammel et al., 2011, DeJong et al., 2019, Menegas et al. 2017; 63 Klanker et al. 2019). This heterogeneity is reflected in dopamine responses to aversive events 64 throughout the striatum: Whereas microdialysis studies report an increase in dopamine release in the 65 nucleus accumbens in response to aversive events (Young et al., 1993; Young, 2004; Wilkinson et al., 66 1998; Bassareo et al., 2002; Pascucci et al., 2007; Ventura et al., 2007; Martinez et al., 2008 but see 67 Mark et al., 1999; Liu et al. 2008), studies employing techniques with a higher, subsecond temporal 68 resolution (e.g., fast-scan cyclic voltammetry (FSCV) or fluorescence fiber photometry) arrive at less 69 consistent conclusions. For example, aversive stimuli produced an increase in dopaminergic activity in 70 the nucleus accumbens shell (NAS) in some studies (Badrinarayan et al., 2012; DeJong et al., 2019), 71 but a decrease in others (Roitman et al., 2008; Wheeler et al., 2011; McCutcheon et al., 2012;

72 Twining et al., 2015). Similarly, contradictory findings are also reported in the neighboring nucleus 73 accumbens core (NAC), where studies find both increased (Budygin et al., 2012; Mikhailova et al., 74 2019) and decreased dopamine activity (Badrinarayan et al., 2012; Oleson et al., 2012; DeJong et al., 75 2019: Stelly et al., 2019). In contrast, in the tail of the striatum, aversive events exclusively result in 76 increased dopaminergic activity (Menegas et al., 2017; Menegas et al., 2018). Overall, it can be 77 concluded that most studies observe a change in dopaminergic activity in response to aversive 78 stimuli, that there are substantial differences between striatal regions in this response, and that it 79 remains unclear what determines whether aversive events provoke an increase or a decrease in 80 dopaminergic activity within striatal regions.

81 Delineating the role of dopamine in processing aversive events crucially requires 82 understanding what the above-described changes in dopamine signaling encode specifically; or in 83 other words, whether these changes reflect aversive-prediction errors (APEs, in which the dopamine 84 response would reflect the discrepancy between expected and received aversive events) or merely 85 individual aspects of aversive conditioning (such as the presence of aversive stimuli, and/or their 86 prediction). A thorough analysis by Fiorillo (2013) concluded that dopaminergic midbrain neurons do 87 not encode aversive stimuli, but other studies have observed aspects of a dopamine APE, such as the 88 predictive cue adopting the dopamine response of an aversive stimulus (Guaracci & Kapp, 1998; 89 Oleson et al., 2012; Badrinarayan et al., 2012), or an APE-like response when the aversive stimulus 90 was unpredicted or omitted (Matsumoto & Hikosaka, 2009; Matsumoto et al. 2016; Menegas et al. 91 2017; Salinas-Hernández et al., 2018; DeJong et al., 2019). However, it should be kept in mind that in 92 case of omission or early termination of an expected aversive event, rewarding aspects of a milder-93 than-expected aversive event (RPE) may be mixed with an APE (Oleson et al., 2012; Salinas-

94 Hernández *et al.*, 2018; Stelly *et al.*, 2019).

95 To consolidate these contradictory findings, we systematically evaluated whether dopamine 96 truly signals an APE through a series of behavioral experiments in rats, in which we varied the value 97 of the aversive stimulus, context valence, and probabilistic contingencies, and compared aversive and 98 appetitive conditioning. Using FSCV, we measured the real-time dopamine response to these 99 conditions in the NAC, since this striatal region is a hot spot for RPE-like signals (Flagel et al., 2011; 100 Papageorgiou et al., 2016) and is also tightly linked to motivational processes related to aversion 101 avoidance (Badrinarayan et al., 2012; Oleson et al., 2012; Stelly et al., 2019). We employed loud 102 white noise (WN) as the aversive stimulus. WN provides several advantages over more commonly-103 used aversive stimuli (such as electric shocks or air puffs), as it is well-tolerated by rats and not 104 painful, precisely-controllable (intensity and duration can be effortlessly titrated), aversive without 105 inducing freezing (most pertinent to the current study, as this might interfere with the dopamine 106 signal), does not jeopardize the recording equipment, does not introduce artefacts to the recordings, 107 and can be administered reliably (see Discussion). Based on the above-described findings, we 108 hypothesized that NAC dopamine would exhibit an APE. However, we find that NAC dopamine 109 concentration ramps down in response to both WN exposures and its predicting cue, ramps back

- 110 upwards upon stimulus cessation, that these ramps were qualitatively different from appetitive
- 111 conditioning, and were inconsistent with a full APE signal.
- 112

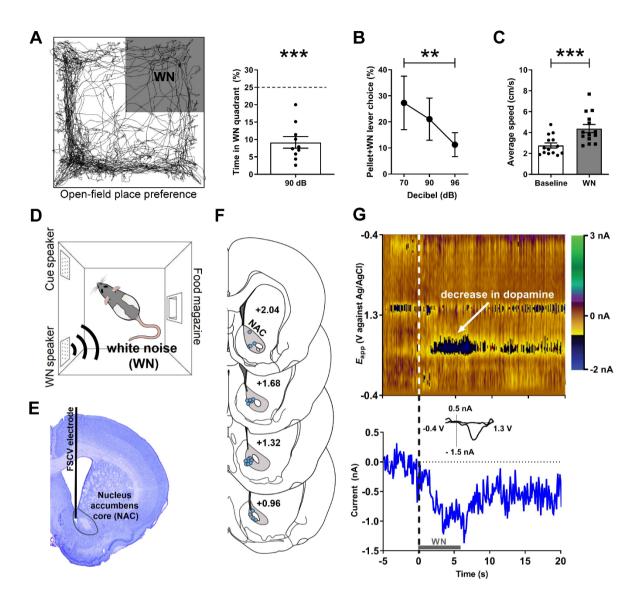
113 **RESULTS**

114 White noise (WN) is aversive

- 115 We established the aversiveness of loud WN using a real-time place-preference test, in which rats
- 116 were exposed to 90-dB WN upon entry into one of the four quadrants of an open field (Figure 1A). An
- example path traversed by a rat over the course of 30 minutes is depicted in Figure 1A (left panel),
- 118 where the dark shaded area represents the quadrant paired with WN. On average, rats (n = 10) spent
- a significantly smaller percentage of time in the WN quadrant (9.71 ± 1.65) compared to chance level
- 120 (t(9) = 9.585, p < 0.0001; Figure 1A, right panel). Next, we validated that rats can discern between
- 121 different magnitudes of WN in an operant choice task. Here, rats could choose between pressing one
- 122 of two extended levers, both of which prompted immediate delivery of a food pellet, but one of which
- additionally presented 5s of 70, 90, or 96 dB WN. Unsurprisingly, rats (n = 6) preferred the non-WN
- 124 lever, as indicated by a significant main effect of WN intensity using a Friedman test ($\chi^2(3) = 11.57$, p
- 125 = 0.0003). Importantly, when comparing the WN-paired lever presses, rats significantly preferred the
- 126 70-dB WN to the 96-dB WN (post-hoc Dunn's tests.p = 0.0027; Figure 1B). Interestingly, exposure to
- 127 WN stimulated locomotor activity: Rats in an operant box significantly increased locomotion speed in
- response to semi-random presentation of 6s-WN bouts (t(13) = 7.059, p < 0.0001; Figure 1C).

129 WN suppresses dopamine release in the nucleus accumbens core (NAC)

- 130 All FSCV recordings (and all behavioral data presented from here on out) were conducted in operant
- boxes equipped with a food magazine, a multiple-tone generator (cue speaker), and WN generators
- 132 (WN speaker) (Med-Associates; Figure 1D). Electrolytic lesions at the FSCV electrode tip were used
- to histologically verify electrode placement (Figure 1E). Histological analysis confirmed for all animals
- 134 included in this study that the sensing end of their FSCV electrodes was consistently placed in the
- 135 NAC (Figure 1F). Unexpected exposure to 6s of 90-dB WN strongly and reliably decreased
- 136 extracellular concentrations of dopamine in the NAC (Figure 1G).



137 Figure 1 - White noise (WN) is an aversive stimulus that lowers dopamine concentration in the 138 NAC. (A) Left: Example trajectory of a rat in the real-time place preference test (30 min), in which 139 entry into the upper-right quadrant (shaded) led to 90-dB WN exposure. Right: Aversiveness of WN in 140 the place preference test quantified as significantly decreased time spent in the WN quadrant (n = 10, 141 9.71 ± 1.65 , t(9) = 9.585, p < 0.0001). (B) Rats (n = 6) discern between different WN magnitudes in 142 an operant choice task, where they had to choose between pressing a lever that resulted in a food-143 pellet delivery and a lever that resulted in a food-pellet delivery plus simultaneous 5s of WN 144 (Pellet+WN; Friedman test, $\chi^2(3) = 11.57$, p = 0.0003). 70 dB was less aversive than 96 dB (p = 145 0.0027). Data are mean±SEM. (C) Semi-random presentations of 6s-WN bouts increased the 146 locomotion speed of rats in an operant box during the WN epoch compared to pre-WN baseline (post-147 hoc Dunn's test, t(13) = 7.059, p < 0.0001). (D) All fast-scan cyclic voltammetry (FSCV) recordings 148 took place in operant boxes equipped with a food magazine, a multiple-tone generator (cue speaker), 149 and a WN generator (WN speaker). (E) Example cresyl violet-stained brain slice depicting an 150 electrolytic lesion in the NAC (outlined) at the tip of the FSCV electrode (vertical black line). (F) 151 Schematic overview of FSCV recording locations (blue dots) in the NAC (gray) of all animals. (G) 152 Single-trial pseudocolor plot (top panel), dopamine trace (bottom panel), and cyclic voltammograms 153 (inset in bottom panel) for representative, dopamine-specific current fluctuations recorded in NAC, 5s

before WN (dashed line), during 6s of WN (gray bar), and 14s after WN.

155 Different temporal NAC dopamine dynamics during aversive and appetitive Pavlovian 156 conditioning

157 Dopamine release in the NAC is often consistent with a temporal-difference RPE, where an increase 158 in dopamine activity, initially time-locked to the delivery of a reward, shifts backwards in time to its 159 predicting cue. It is assumed that this phenomenon reflects the learned association between 160 predictive cue and reward, where the reward becomes fully predicted by the cue and, therefore, no 161 prediction error occurs at the time of reward delivery after sufficiently repeated cue-reward pairings 162 (e.g., Schultz et al., 1997; Flagel et al., 2011). Our first experiment investigated whether a similar 163 phenomenon also applies to aversive stimuli and their predictors, and in what time frame such a shift 164 may occur. Rats (n = 16) were exposed to 30 pairings of cue (5s) and 90-dB WN (6s) that were 165 separated by a variable inter-trial-interval (Figure 2A). In order to visualize the rapid changes in 166 dopamine response presumably reflecting learning, the first five trials are depicted individually, and 167 based on their stable visual appearance, trials 6-10 and 11-30 were binned together. Using one-way 168 repeated measures ANOVAs, in which we compared the average dopamine concentration during 169 baseline, cue, and WN epochs, we found significant main effects in all trials (Trial 1: F(1.403, 19.65) = 170 6.853, p = 0.0102; Trial 2 ; F(1.324, 19.86) = 8.205, p = 0.0059; Trial 3; F(1.265, 18.98) = 6.737, p = 171 0.013; Trial 4: F(1.100, 16.50) = 5.016, p = 0.0363; Trial 5: F(1.548, 23.23) = 21.90, p < 0.0001; Trials 172 6-10: F(1.025, 15.38) = 15.94, p = 0.0011; Trials 11-30: F(1.093, 16.39) = 38.42, p < 0.0001). Post-173 hoc analyses using Wilcoxon signed-rank tests with a Holm-Bonferroni multiple-comparison correction 174 revealed significantly lower dopamine concentrations during the WN epoch compared to pre-cue 175 baseline during trial 1 (Z = -1.988, p = 0.0235), trial 2 (Z = -2.430, p = 0.0075), trial 3 (Z = -2.327, p = -2.176 0.010), trial 5 (Z = -3.464, p < 0.0005), trials 6-10 (Z = 3.103, p = 0.001) and trials 11-30 (Z = -3.516, p 177 < 0.0001), indicating that the decrease in dopamine during WN is an unconditioned response, since it 178 is observed already during the first trial. In contrast, we only observed significantly lower dopamine in 179 the cue epoch compared to pre-cue baseline during trial 5 (Z = -1.965, p = 0.0245), trials 6-10 (Z = -1.965), trials 6-10 180 2.999, p = 0.0015), and trials 11-30 (Z = -3.516, p < 0.0001), indicating that this decrease develops 181 over time and, therefore, is a conditioned response. In these first 30 trials, the decrease in 182 extracellular dopamine during the WN epoch did not disappear or decrease. Thus, WN does not 183 provoke a substantial temporal shift of NAC dopamine signaling from unconditioned to conditioned

184 (predictive) cue within the first session of training.

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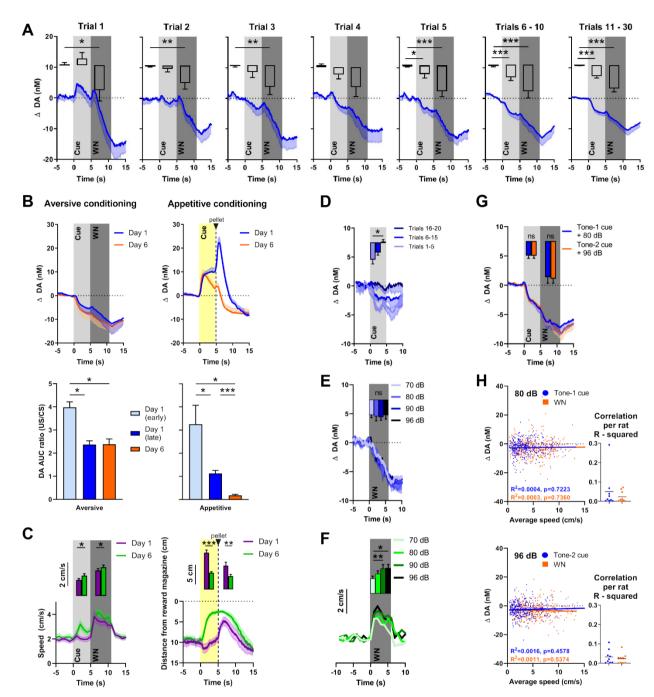


Figure 2 - NAC dopamine signaling and rat behavior during Pavlovian WN-cue conditioning
 and varying WN intensities. (A) Average extracellular concentrations of dopamine (DA; in nM) in

187 the NAC (dark-blue line; SEM is shaded light-blue) during the first 30 pairings of cue (5 s tone) and 188 WN (6 s, 90 dB) (16 rats). To illustrate the immediate, unconditioned effects of WN, the first five trials 189 are displayed individually. The bar-graph insets depict dopamine release (+SEM) averaged for 190 baseline, cue, and WN epochs. WN decreased dopamine significantly in all trials, except trial 4. The 191 WN-paired cue began to decrease dopamine significantly starting at trial 5. (B) Comparison of 192 dopamine release during aversive (left, n = 4) and appetitive (right, n = 10) Pavlovian conditioning. 193 Top: Subsecond changes in dopamine concentration (nM) on day 1 (blue) and day 6 (orange). 194 Bottom: Ratio (+SEM) of AUCs between the CS and US (US/CS) on day 1 (early and late trials) and 195 day 6 during aversive (left) and appetitive (right) conditioning. For aversive conditioning, dopamine 196 differed between day 1 (early) and day 1 (late) (p = 0.0138), and between day 1 (early) and day 6 (p =197 0.0318). For appetitive conditioning, a significant difference was found between early and late

198 conditioning on day 1 (p=0.0441) and dopamine differed between day 1 (early) (p = 0.0102) and day 1

199 (late) (p < 0.0001) compared to day 6. (C) Conditioned behavioral response corresponding to (B). 200 Left: During aversive conditioning, locomotion speed during cue presentation increased from day 1 to 201 day 6 (Z = , p = 0.0491), and also during WN (Z = -2.343, p = 0.0.019) (n = 17). Right: During 202 appetitive conditioning, time spent in proximity of the reward magazine increased between day 1 and 203 6 both during cue presentation (t(9) = 6.962, p < 0.0001) and after pellet delivery (t(9) = 2.572, p = 204 0.0301). (D) In an extinction session, for 20 consecutive trials, WN was withheld after cue 205 presentation (n = 6), and dopamine differed significantly between trials 1-5 and 16-20 (p = 0.0133). 206 (E) In contrast, we detected no differences in dopamine release between exposure to varying WN 207 intensities (70, 80, 90, or 96 dB; (F(2.380, 11.90) = 0.1655, p = 0.8813), n = 6). (F) While we do find a 208 main effect of WN intensity on locomotion speed ($\chi^2(3) = 13.80$, p = 0.0032) and significant 209 differences between 70 and 90 dB (p = 0.005) and 70 and 96 dB (p = 0.0143)(n = 13). (G) We 210 observed no significant differences in dopamine during cue (Z = -0.059, p = 0.953) or WN (Z = -0.178, 211 p = 0.859) when two separate tones were used as predictors for 80-dB (blue) or 96-dB (orange) WN 212 (n = 9). (H) Trial-by-trial correlation between locomotion speed and dopamine concentration during 213 cue (blue) and WN (orange) for either 80-dB (top) or 96-dB WN (bottom) were not significant. Each 214 dot represents one trial. Trials from all animals (n = 9) were pooled. Top left: No correlation during 80-215 dB WN ($R^2 = 0.0016$, p = 0.457) or its cue ($R^2 = 0.0004$, p = 0.7223). Bottom left: No correlation during 216 96-dB WN ($R^2 = 0.0011$, p = 5374) or its cue ($R^2 = 0.0003$, p = 0.7360). Right; R^2 values calculated 217 separately for each individual rat confirms there is no significant correlation between locomotion 218 speed and dopamine.

219 One possible explanation for an incomplete shift of dopamine signaling from WN to cue is that 30 220 pairings are insufficient to fully acquire the association. Therefore, we conditioned a subset of rats (n 221 = 4) for five additional days. Another group of rats (n = 10) received food-pellet rewards paired with a 222 predictive cue to compare the temporal dynamics of aversive (90-dB WN; Figure 2B, left) and 223 appetitive (reward) conditioning (Figure 2B, right). Changes in dopamine are illustrated across time 224 (Figure 2B, top), and in order to quantify the shift of the dopamine response from the US to the CS, 225 we calculated the ratio between the areas under the curve (AUC) of the US and the CS during the 226 very first trials of conditioning ('early day 1'), the rest of the trials of day 1 ('late day 1') and on the sixth 227 day of conditioning ('day 6') (see bottom figure 2B). During aversive conditioning we find, using a 228 mixed-effects analysis, a significant main effect of the amount of conditioning (F(0.9586. 229 2.396)=117.3, p =0.0043), and post hoc testing using Tukey's multiple comparisons test reveals 230 significant differences between the ratios of day 1 early trials and day 1 later trials (p = 0.0138), as 231 well as between day 1 early trials and day 6 (p = 0.0318). However, no difference was observed 232 between day 1 later trials and day 6 (p = 0.9852). During appetitive conditioning we also find a main 233 effect of the amount of conditioning on the ratio between the US and the CS (F(1.034,8.788)=13.88, 234 p=0.0047) and in contrast to aversive conditioning the ratio on day 6 is significantly different from both 235 day 1 early trials (p=0.0102) and day 1 later trials (p<0.0001). In addition, we find a significant 236 difference between day 1 early trials and day 1 later trials (p=0.0441). The comparison of conditioned 237 behavioral responses to 90-dB WN between day 1 and day 6 using Wilcoxon-signed rank tests and a 238 Holm-bonferonni correction for multiple comparisons reveals an increase in locomotion speed (Figure 239 2C, compared to baseline which, on day 1, was restricted to the WN epoch alone (Cue: Z = -0.876, 240 p=0.381. WN: Z = -3.621, p <0.0001). On day 6 we observe an increase in locomotion speed during 241 both the cue (Z = -3.053, p = 0.002) and WN (Z = -3.621, p < 0.0001) epoch compared to baseline 242 which are both also significantly higher compared to day 1 (cue: Z = -2.485, p = 0.013. WN: Z = -

- 243 2.343, p = 0.019). During appetitive conditioning we see the same temporal evolution in the
- conditioned response, where rats approach the reward magazine more during the cue epoch on day 6
- compared to day 1 (t(9) = 6.962, p < 0.0001). However, during appetitive conditioning, but not during
- 246 aversive conditioning, an almost complete shift of the dopamine response from the CS to the US
- 247 occurred. Together, these results demonstrate distinct differences in the temporal dynamics of
- 248 dopamine signaling during aversive and appetitive conditioning.

249 Extinction of cue-induced dopamine signaling

- 250 In addition to having monitored the quick acquisition of the cue's dopamine-decreasing properties
- 251 (Figure 2A), to further verify that these properties were a learned response, we tested how fast the
- association between cue and WN could be extinguished. Rats with well-established cue-WN
- associations (that were conditioned for more than 6 days) were exposed to 20 consecutive trials in
- which WN was omitted. Using a Friedman test, we found a significant effect of extinction ($\chi^2(2) = 8.4$,
- 255 p = 0.005). Post-hoc analysis using a Dunn's multiple comparison test revealed a significant
- difference between the decrease in extracellular dopamine concentration of trials 1 5 and trials 16 -
- 257 20 (p = 0.0133, Figure 2D), with the latter no longer showing a decrease in dopamine. Thus, over the
- course of 15 extinction trials, the cue lost its conditioned dopamine response.

259 NAC dopamine does not reflect WN intensity and WN-induced behavior

260 For the previous experiments, we used WN with an intensity of 90 dB. We asked whether WN of 261 different intensities would differentially influence extracellular dopamine in the NAC, since we 262 observed increased avoidance of higher intensities of WN (Figure 1B). First, we tested whether there 263 is a dose-response relationship between different WN intensities and dopamine. We exposed rats (n 264 = 6) to four different intensities of WN (70, 80, 90 and 96 dB), which were delivered in a semi-random 265 order (Figure 2E). Although all WN intensities decreased dopamine release, we found no significant 266 effect of intensity on extracellular dopamine (F(2.380, 11.90) = 0.1655, p = 0.8813). In order to 267 confirm the rats' capability to discriminate between the different WN intensities in this experimental 268 setting, we exposed additional rats to the same intensities and quantified their locomotion speed 269 (Figure 2F; n = 13). In contrast to dopamine release, we do find a main effect of WN intensities on 270 baseline-subtracted locomotion speed ($\chi^2(3) = 13.80$, p = 0.0032) and significant differences between 271 70 and 90 dB (p = 0.005) and 70 and 96 dB (p = 0.0143), which demonstrates that rats were able to 272 discriminate between the different WN intensities. In a different experiment, we trained rats (n = 9) on 273 an aversive conditioning paradigm in which two cues (2 kHz or 8 kHz tones) predicted exposure to 6s 274 of either 80-dB or 96-dB WN, respectively (Figure 2G). Again, no significant differences were found in 275 extracellular dopamine release between WN intensities (Z = -0.178, p = 0.859), nor between the 276 effects of their respective predicting cues (Z = -0.059, p = 0.953). Both of these experiments indicate 277 that extracellular dopamine in the NAC does not encode WN intensity, and, therefore, the relative 278 aversiveness or aversive value of WN is not encoded by NAC dopamine in the NAC.

279 Many studies have demonstrated the involvement of dopamine in movement (e.g., Syed et al., 2015;

- Alves da Silva *et al.*, 2018; Cuddington & Dudman, 2019). Therefore, we tested if a correlation
- 281 between locomotion speed and extracellular dopamine concentration existed during cue and WN
- epochs. We performed a trial-by-trial analysis for both 80-dB (Figure 2H, top) and 96-dB (figure 2H,
- bottom) WN exposures and found no correlation during the cue (80 dB: $R^2 = 0.0004$, p = 0.7223; 96
- 284 dB: R² = 0.0003, p = 0.7360) nor during WN (80 dB: R² = 0.0016, p = 0.4578; 96 dB: R² = 0.0011, p =
- 285 0.5374). The dots in the inset graphs represent the R² values of the average locomotion speed and
- 286 dopamine concentrations during the cue and WN period in the recording session for each individual
- 287 animal.

288 NAC dopamine signals contain little prediction error

289 Although the WN-predictive, conditioned cue acquired the ability to reliably suppress NAC dopamine 290 release, no substantial transfer of this effect from US to CS occurred (a prerequisite for a prediction 291 error signal). To further evaluate whether NAC dopamine might function as an APE, we introduced 292 several deviations from the expected outcomes. First, we exposed rats to two different cues (2 kHz or 293 8 kHz tones) that were associated with different probabilities followed by either 80-dB or 96-dB WN 294 (see Figure 3A). Even though dopamine did not encode WN intensity, we hypothesized that dopamine 295 may nonetheless convey an error component to be reflected as diminished dopamine decrease during 296 the better-than-expected condition (occurence of low-probability (25%) 80-dB WN), and augmented 297 decrease in dopamine during the worse-than-expected condition (occurence of low-probability (25%)) 298 96-dB WN). As expected, we did not observe differences in dopamine release during the cue epoch 299 due to the uncertainty of which intensity would follow (Tone 1: t(8) = 0.5983, p = 0.5662. Figure 3B: 300 Tone 2: t(8) = 1.432, p = 0.1901, Figure 3C). However, during the WN epoch, we also did not find 301 significant differences between the two intensities, neither for tone 1 (t(8) = 0.6698, p = 0.5218), nor 302 for tone 2 (t(8) = 0.4452, p = 0.6680). Together, these results indicate that the prediction error of 303 outcomes deviating from expected probability is not encoded by NAC dopamine concentrations.

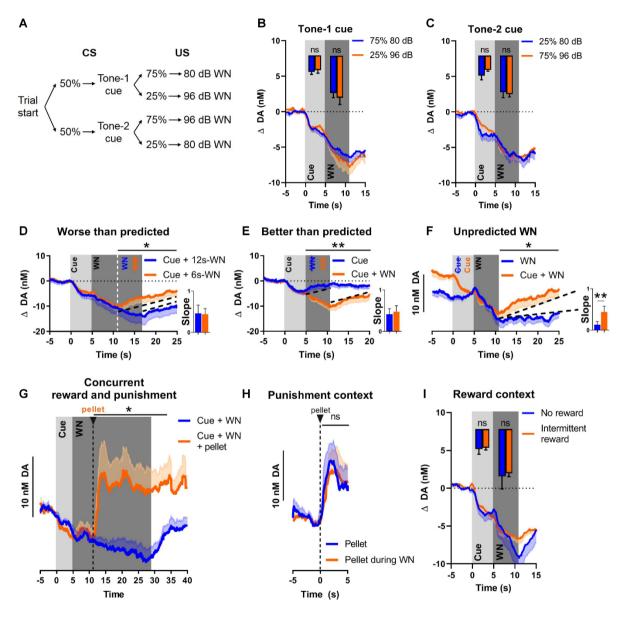
304 Since WN intensity had little influence on dopamine release, we investigated whether an APE was

305 detectable when deviations from the expected outcome occurred in the temporal domain (i.e.,

duration of WN). We randomly exposed rats to a small number of probe trials with a) a longer-than-

- 307 predicted 90-dB WN (12s instead of 6s), in other words a worse-than-predicted outcome (Figure 3D),
- b) omitted WN, in other words a better-than-predicted outcome (Figure 3E), or c) unpredicted WN, in
- 309 other words another version of a worse-than-predicted outcome, but in this case lacking the prediction
- 310 completely (Figure 3F). These three types of probe trials were implemented in a session in which the
- 311 first 30 trials consisted of exclusive, deterministic pairings of cue (5s) and 90-dB WN (6s), after which
- these regular predicted WN trials were intermixed with the above-mentioned probe trials. During the
- 313 worse-than-predicted WN trials where the WN was extended by 6s, we observed an extended
- 314 suppression of dopamine, which decreased with the same rate as during the initial 6s, and which
- 315 ceased immediately upon termination of WN, resulting in a overall lower dopamine concentration in
- the 11-25 s epoch (Figure 3D; t(10) = 1.863, p = 0.046, after Holm-Bonferroni correction for multiple

- 317 comparisons). During better-than-predicted trials (omitted WN), we found overall higher
- 318 concentrations of dopamine in the 5-20 s epoch (Figure 3E; t(10) = 3.751, p = 0.0019, after Holm-
- 319 Bonferroni correction). For the unpredicted WN, which constitutes a prediction error since the
- 320 predictive cue is lacking, we aligned dopamine concentrations for predicted and unpredicted WN at its
- 321 onset, in order to compare the impact of WN per se. We observed significantly lower dopamine
- 322 concentrations exclusively in the epoch after the termination of the WN (Figure 3F; 11-25 s, t(10) =
- 323 2.453, p = 0.0170, after Holm-Bonferroni correction), but not during the WN epoch itself.



324 Figure 3 - NAC dopamine consistently tracks prediction and duration of WN with little aversive 325 prediction-error function. (A) Trial structure of the probabilistic Pavlovian WN task. (B) Dopamine 326 concentration in the probabilistic task during the presentation of tone-1 cue, which was followed by 327 80-dB WN (blue) in 75% of trials and by 96-dB WN (orange) in the remaining 25% of trials. Bar-graph 328 inset: No significant differences in average dopamine concentration (n = 9) during cue (t(8) = 0.5983). 329 p = 0.5662) and WN (t(8) = 0.6698, p = 0.5218). (C) Dopamine concentration in the probabilistic task 330 during the presentation of tone-2 cue, which was followed by 80-dB WN (blue) in 25% of trials and by 331 96-dB WN (orange) in the remaining 75% of trials. Bar-graph inset: No significant differences in

332 average dopamine concentration (n = 9) during cue (t(8) = 1.432, p = 0.1901) and WN (t(8) = 0.4452, 333 p = 0.6680). (D) Comparison of dopamine between predicted 6s-WN (orange) and worse-than-334 predicted 12s-WN (blue) (n = 11) demonstrates significantly lower average dopamine in the epoch 335 between 11-25 s during worse-than-predicted 12s-WN (t(10) = 1.863, p = 0.046). Bar graph (right): 336 Slopes of dopamine-concentration trajectories (black dotted lines) show no significant difference 337 between worse-than-predicted and predicted WN (Z = -1.432, p = 0.0775). (E) Comparison of 338 dopamine between predicted 6s-WN (orange) and better-than-predicted, omitted WN (blue) (n = 11) 339 demonstrates significantly higher average dopamine in the epoch between 5-20 s during better-than-340 predicted, omitted WN (t(10) = 3.751, p = 0.0019). Bar graph (right): Slopes of dopamine-341 concentration trajectories (black dotted lines) show no significant difference between better-than-342 predicted and predicted WN (Z = 1.334, p = 0.091). (F) Comparison of dopamine between predicted 343 6s-WN (orange) and unpredicted 6s-WN (blue) (n = 11) demonstrates significantly lower average 344 dopamine in the epoch between 11-25 s during unpredicted WN (t(10) = 2.453, p = 0.0170). Bar 345 graph (right): Slopes of dopamine-concentration trajectories (black dotted lines) show a significantly 346 flatter slope during unpredicted WN compared to predicted WN (Z = -2.490, p = 0.0065). (G) 347 Dopamine release during prolonged 24s-WN exposure (blue) continues to incrementally decrease 348 over time. Unexpected reward delivery (n = 6) during such 24s-WN (orange) induces an increase in 349 dopamine in the epoch between 11-35 s (t(5) = 3.108, p = 0.0266). (H) Comparison of dopamine after 350 unexpected pellet delivery (blue) and after unexpected pellet delivery during WN exposure (orange) (n 351 = 6) show no significant difference in average dopamine in the epoch between 0-5 s (t(5) = 0.08753, p 352 = 0.9336). (I) Comparison of dopamine during WN exposure in a testing context without rewards 353 (blue) and a testing context with intermittent rewards (orange) (n = 6) shows no significant difference 354 in average dopamine during the cue (t(5) = 0.2841, p = 0.7877) and WN (t(5) = 0.3151, p = 0.7654).

355 Although we did not detect a dopamine error-signal during exposure to WN (i.e., deviations from

356 expected WN), we hypothesized that such unexpected events may alter dopamine after WN-offset.

357 Thus, we compared the slope (or rate) of change of dopamine concentration during the recovery

epoch (after WN cessation), since using slope allows for integration of the change in dopamine

359 concentration over time, when the animals were presented with deviations from the predicted aversive

- event. Specifically, we found no significant slope difference between fully predicted WN trials and
- 361 "worse-than-expected" trials (t(10) = 0.1511, p = 0.4415, after Holm-Bonferroni correction, Figure 3D,
- bar graph) or "better-than-expected" trials (t(10) = 0.4809, p = 0.3205, after Holm-Bonferroni
- 363 correction, Figure 3E, bar graph). Thus, when our rats were exposed to unexpectedly extended WN or
- to the unexpected omission of WN, dopamine concentration reflected only the duration of WN
- 365 exposure, but not a prediction error. In contrast, we found a significant difference in recovery slope
- between unexpected and expected WN (t(10) = 2.895, p = 0.0080, after Holm-Bonferroni correction,
- 367 Figure 3F, bar graph), which indicates that, in the case of an unexpected aversive stimulus, dopamine
- does not only track the duration of this aversive stimulus, but displays a differential response and,
- thus, may serve as a qualitative teaching signal.

370 Dopamine integrates information about appetitive and aversive stimuli

We then investigated whether dopamine could still encode rewards during ongoing WN exposure, i.e.

- 372 while extracellular dopamine concentrations are continuously decreasing. To test this, we delivered
- food pellets unexpectedly during a prolonged WN epoch. We observed a significant increase in
- dopamine release upon pellet delivery (t(5) = 3.108, p = 0.0266, Figure 3H), which was comparable to
- 375 the increase in dopamine release we observed upon pellet delivery in the absence of WN (t(5) =

0.08753, p = 0.9336, Figure 3I). These results indicate that dopamine is still responsive to rewarding
events during an aversive event and, thus, integrates information about appetitive and aversive
events.

379 A previous study reported that dopamine is more prone to encode an APE in an experimental context 380 with a low probability of intermittent reward delivery (Matsumoto et al., 2016). Thus, we compared 381 dopamine release during cue and WN exposure embedded in two task contexts with different reward 382 probabilities (i.e., different "reward contexts"). In the first task context, no rewards were delivered 383 during the entire session, whereas in the second context a low chance of reward delivery existed 384 (reward-trial probability = 0.1). We did not observe a significant difference in dopamine concentration 385 between these reward contexts during the cue epoch (t(5) = 0.2841, p = 0.7877), nor during the WN 386 epoch (t(5) = 0.3151, p = 0.7654) (Figure 3J). Consistently, in another experiment, we did not observe 387 a significant difference in dopamine concentration (during cue and WN epochs) when comparing a no-388 reward context with a high-reward context (reward-trial probability= 0.5; cue: t(17)=1.448, p=0.0829,

389 WN: t(17)=1.428, p=0.0857; data not shown).

390

391 DISCUSSION

392 In this study, we set out to delineate the role of the dopamine system in processing aversive stimuli, 393 by systematically investigating subsecond fluctuations in rat NAC dopamine concentration in response 394 to an aversive auditory stimulus (WN), as well as its prediction by auditory tone cues. First, we 395 validated the aversiveness of WN in a real-time place-preference task and in an operant task, where 396 we found that WN aversiveness scales with loudness. Trial-by-trial analysis of the first WN exposures 397 revealed that WN as an unconditioned stimulus diminishes the concentration of extracellular 398 dopamine in the NAC, and that a predicting cue rapidly takes on the roll of conditioned stimulus 399 (reversible by extinction), eliciting WN-like behavioral activation and dopamine depression. Dopamine 400 during cue and WN was not correlated with locomotion speed. In contrast to appetitive conditioning, 401 only a very limited temporal shift of the dopamine response from WN to the cue occurred. Dopamine 402 responses to WN and its predictive cue were not affected by aversive value (WN intensity), context 403 valence (introduction of intermittent rewards), or probabilistic contingencies. Instead, prediction and 404 duration of the aversive WN were accompanied by a relatively slow and steady decrease in NAC 405 dopamine concentration (a declining ramp that continued without plateauing for at least 24 seconds), 406 which was followed by an equally slow recovery of dopamine upon cessation of WN. The slope of this 407 rebounding dopamine ramp was altered only by unpredicted presentation of WN (not by better-than-408 predicted or worse-than-predicted outcomes), revealing a function of dopamine that sometimes goes 409 beyond simple real-time tracking the presence of conditioned and unconditioned aversive stimuli. 410 Finally, we find the integration of rewarding and aversive stimuli is of parallel nature, as WN-411 associated dopamine depression did not modify the rapid surge of dopamine triggered by unexpected

412 reward delivery. Together, our findings indicate that negative dopamine signals in the NAC mostly

track the prediction and duration of aversive events, with few aspects that are consistent with an APE.

WN is a versatile aversive stimulus that suppresses dopamine release and increaseslocomotion

416 We chose WN as an aversive stimulus to probe the limbic dopamine system's role in aversive 417 conditioning, as it has several advantages compared to more commonly-used aversive stimuli. First, 418 WN is mildly to moderately aversive (Campbell & Bloom, 1965; Hughes & Bardo, 1981), and as such 419 does not induce freezing, but instead provokes mild behavioral activation. This is particularly relevant 420 with regard to studies relating dopamine function to behavioral read-outs, since lack of movement is 421 often associated with diminished activity of the dopamine system and, thus, may confound the 422 interpretation of negative dopamine signals in the context of aversive events. Second, WN is reliably 423 effective and tolerated across many trials and sessions, supporting the detection of neuronal signals 424 by providing sufficient data for averaging across trials and enabling complex experiments with varying 425 valence and contingencies. Third, WN is distinct, well-controllable, and easy to produce, where 426 intensity and duration can be titrated effortlessly. Fourth, WN does not require attention to be detected 427 (i.e., the animal will hear it anywhere in an experimental environment). Fifth, animals cannot interfere 428 with WN delivery, as opposed to air puffs or electric foot shocks, which can be influenced by the 429 animal's actions and position (i.e., closing its eyelids or decreasing contact surface with the charged 430 grid floor). Sixth, WN does not interfere with data recording in FSCV, electrophysiology, or 431 fluorescence imaging. Together, the above-mentioned merits make WN an experimentally valuable

432 stimulus with great potential to uncover aversion-relevant brain mechanisms.

433 In the presented work, we report that WN diminishes extracellular dopamine concentration in 434 the NAC upon first exposure, characteristic of an unconditioned stimulus or primary reinforcer. A 435 predicting cue quickly adopted this property upon subsequent exposures, which was reversible by 436 extinction. Such dopamine responses were stable across trials and sessions. Interestingly, the use of 437 WN revealed a rare relationship between dopamine and behavior: Increased locomotion speed was 438 associated with a decrease in dopamine release. Behavioral activation is usually associated with 439 increased dopamine signaling (Boureau & Dayan, 2011; Berridge & Robinson, 1998; Alves da Silva et 440 al., 2018; Cuddington & Dudman, 2019), whereas a lack of movement or even freezing, depending on 441 stimulus intensity, is often associated with decreased dopamine (e.g., Oleson et al., 2012; 442 Badrinaravan et al., 2012). These frequently-observed association patterns have prompted the 443 hypothesis that the directionality of changes in dopamine concentration reflects the chosen strategy: 444 An active or passive behavioral reaction to aversive events (Badrinarayan et al., 2012). Our results, 445 however, prove that this hypothesis is not universally applicable. The behavioral activation we 446 observe in response to WN might reflect an increased motivation to escape, which we cannot 447 ascertain as our task was Pavlovian (thus, without an active avoidance component: the WN was

inescapable). Notably, the observed decline in dopamine was not at all correlated with movement on

449 a trial-by-trial basis; thus, it is conceivable that during mild WN exposure, NAC dopamine was450 uncoupled from its usual, more direct behavioral impact.

450 uncoupled from its usual, more direct behavioral impact.

451 What is and what is not encoded by NAC dopamine?

452 Many studies have investigated the role of dopamine in aversion by testing the system's reaction to 453 the exposure to aversive stimuli (see above), but only a few scrutinize dopamine's precise function 454 therein, or whether dopamine encodes a "true" APE. Their conclusions range from "dopamine is 455 insensitive to aversiveness" (Fiorillo, 2013), to the other extreme of "dopamine serves as an APE" 456 (Matsumoto et al., 2016). Fiorillo (2013) ruled out the existence of a dopamine APE because 1) 457 dopamine-neuron firing did not differ between presentation of aversive and neutral stimuli, 2) 458 prediction of an aversive event did not affect firing, and 3) no integration of rewarding and aversive 459 values was observed. In contrast, Matsumoto et al. (2016) found evidence for all three of these 460 requirements and, therefore, concluded that dopamine neurons are capable of encoding a value 461 prediction error (equally for both rewards and aversive stimuli). This discrepancy could partially be explained by the fact that Matsumoto et al. (2016) recorded from dopaminergic neurons in the VTA (of 462 463 mice), whereas the majority of the neurons that Fiorillo (2013) recorded were in the substantia nigra 464 (of monkeys). Since we measured extracellular concentrations of NAC dopamine, which is released 465 from terminals that originate from neurons in the VTA (Ikemoto, 2007), we expected to find an APE in 466 our data.

467 Indeed, our results meet Fiorillo's (2013) three requirements for an APE stated above: 1) 468 During the first pairing of cue and WN, when the predictive auditory cue was still neutral, dopamine 469 concentration during the WN epoch differed significantly from that during baseline and cue 470 presentation, but the latter (cue and baseline dopamine) did not differ from each other. 2) After only 471 four cue-WN pairings, cue presentation diminished dopamine concentration, thus prediction of the 472 aversive event did alter dopamine activity. Although we did not find a significant difference in overall 473 dopamine concentration between predicted and unpredicted WN, we did observe a difference in their 474 post-WN recovery slopes. 3) Finally, although we did not detect an "interactive" integration (modulated 475 signal) of aversive and reward values during concurrent presentation of WN and a food pellet (as the 476 absolute magnitude of released dopamine was equal to that of a pellet delivered outside of WN 477 exposure), both the rewarding and aversive stimuli were encoded in parallel. The signals are thus 478 integrated in the sense that both are processed at the same time, in an additive manner; as opposed 479 to an exclusive organization, where the dopamine system may be "turned off" or unresponsive 480 towards rewards during the presence of an aversive stimulus. Taken together, up to this point, our 481 results fit best with the conclusion of Matsumoto et al. (2016); although a noteworthy contrast is that in 482 our data, context was irrelevant to the magnitude of dopamine response to the aversive event and 483 reward: It made no difference for the acute dopamine response magnitude whether the aversive 484 stimulus was delivered in rewarding contexts or not.

485 Next, however, we took inspiration from Hart *et al.* (2014), who used a mathematical
486 approach developed by Caplin and Dean (2007) to confirm the encoding of RPE signals by NAC

487 dopamine. They used a deterministic and a probabilistic choice task in order to determine whether 488 dopamine signals fulfilled three axioms that were considered necessary for a RPE signal: "consistent 489 prize ordering", "consistent lottery ordering", and "no surprise equivalence". We employed the above-490 mentioned deterministic and probabilistic Pavlovian conditioning tasks to identify an APE, instead of 491 an RPE, by exposing rats to low- and high-dB WN, predicted by two different tones, with either a 492 100% probability (deterministic task) or with different probabilities (probabilistic task). We did not 493 observe differences in dopamine concentration during the WN epoch in the deterministic task, which 494 fulfills the third axiom (no surprise equivalence), since the prediction error is zero for both of these 495 conditions. But the first two axioms were not fulfilled, since we did not detect differences in dopamine 496 during the WN epoch, when different WN intensities were presented with different probabilities. Rats 497 avoided higher-dB WN more than lower-dB WN (Figure 1B) and exhibited WN dB-dependent 498 locomotor activation (Figure 2F), indicating that WN aversiveness scales with WN intensity and that 499 rats are able to discriminate between different WN intensities. Thus, we conclude that the NAC 500 dopamine signals we observed did not fulfill the axiomatic criteria of an APE, when aversive-stimulus 501 intensity or value was varied.

502 Finally, we performed experiments to probe the dopamine signal in conditions where the 503 aversive stimulus deviated from the expected duration, in other words, when trials were worse or 504 better than predicted based on WN duration, but with a stable intensity of 90 dB. First, we extended 505 WN duration or omitted WN in occasional trials. Extended WN elicited a continuation of the same 506 declining dopamine-concentration slope, which ceased promptly at WN cessation, after which 507 dopamine slowly ramped back up towards baseline with a reversed, inclining slope. Thus, although 508 the signal reflected the duration of extended WN, no discernable error component was evident. When 509 WN was omitted, we did not observe an error signal either: Instead, again, the signal slowly returned 510 to baseline levels. Second, in another version of the "worse-than-expected" condition, we occasionally 511 delivered WN unexpectedly, without a preceding cue (after animals had learned the cue-WN 512 association well), and observed a difference in the recovery slope after WN-offset as compared to 513 predicted WN. This flattened recovery slope indicates that NAC dopamine signals more than simply 514 track the presence of aversive stimuli; in addition, it may relate to the failed anticipation of an aversive 515 event (based on reliance on the predictive cue), and, thus, indicate altered cue-WN contingencies. In 516 summary, we conclude that dopamine precisely tracks aversive-stimulus duration, and the only 517 evidence of an APE-like signal in our data was found after unpredicted WN, whereas several of our 518 other experimental accounts are incompatible with an APE function of NAC dopamine. This places 519 our results firmly in the middle ground between the no-APE (Fiorillo, 2013) and the full-APE 520 conclusions (Matsumoto et al. 2016) described above.

521 Aversion versus reward

522 Consistent with most literature (Badrinarayan *et al.,* 2012; Oleson *et al.,* 2012; DeJong *et al.,* 2019;

523 Stelly *et al.*, 2019), we find that NAC dopamine encodes rewarding and aversive events with opposite

524 directionality. Furthermore, we report that a cue predicting an aversive stimulus can adopt the ability

525 to prompt a decrease in dopamine the way the aversive stimulus itself would. Taken together, this 526 suggests that NAC dopamine encodes both reward and aversive prediction. However, decreases in 527 dopamine concentration did not scale with WN intensity, unlike what is well-established for reward 528 processing, where reward size or probability is encoded both for the reward itself and for predictive 529 stimuli (Gan et al., 2010; Tobler et al., 2015; Watabe-Uchida et al., 2017). Furthermore, encoding of a 530 prediction error, which is one of the best characterized features of reward-related dopamine signaling, 531 did not occur for aversive events. Thus, NAC dopamine does not encode aversive and appetitive 532 stimuli (and their prediction) in the same way. Moreover, the basic nature of aversion-related 533 dopamine signals in our data was different from that of rewards. For example, the temporal signal shift 534 towards the earliest predictor of the respective reinforcing stimulus, as described for rewards, is 535 incomplete for aversive conditioning. Another example is that reward-related changes in extracellular 536 dopamine concentration are substantially larger and faster compared to aversive events. These 537 discrepancies may be partially attributable to general differences between dopamine release into and 538 removal from the extracellular space. More specifically, the dopamine system presumably has a 539 bigger dynamic range for increasing activity; it can do so, for example, by increasing the number of 540 cells firing and their firing frequency (and thereby the total number of dopamine-containing vesicles 541 being released). In contrast, dopamine-signaling reduction cannot drop below a certain point, since 542 the cells' maximum response is to cease firing altogether and extracellular dopamine can only be 543 removed relatively slowly or must diffuse away. This disparity could translate into a structurally-limiting 544 factor on what can be encoded by a reduction in dopamine concentration and explain some of the 545 above-mentioned differences in function. However, the slow-ramping declining and recovery slopes 546 we observed do not reflect the system limits, since the very first exposure to WN resulted in a steeper 547 decline and rewards given during WN resulted in steeper increases. Furthermore, disparate 548 qualitative differences were also found in NAC dopamine responses to the presentation of ultrasonic 549 vocalizations that are associated with rewarding and aversive events (Willuhn et al., 2014b). Taken 550 together, our results indicate there are a few similarities between dopamine encoding of rewards and 551 aversive stimuli, but overall find more differences between them - hinting at aversive events being 552 encoded by NAC dopamine more rudimentarily, in a qualitative instead of quantitative fashion.

553 In summary, our findings demonstrate that WN is a valuable and versatile aversive stimulus that is 554 well-suited to probe how the brain processes aversive stimuli. Overall, we conclude that dopamine 555 tracks the anticipation and duration of an aversive event. This tracking materializes as a perpetually 556 declining dopamine ramp that progresses without altering its slope until offset of the aversive stimulus 557 (even WN lasting for 24 s did not reach a plateau of minimal dopamine concentration). Such aversion 558 tracking may play an anticipatory role for certain defensive behaviors, since the animals were 559 behaviorally activated during the aversive event. Furthermore, we speculate that these slowly ramping 560 aversion signals may contribute to a qualitative learning signal (other than a quantitative or scalar 561 APE signal), since the unexpected aversive stimulus elicited a response beyond simply tracking the 562 stimulus. Thus, we conclude that dopamine tracks both positive and negative valence in their 563 temporal aspects and prediction, but that quantitatively speaking, the exact value and error is only

- 564 encoded for rewards, in the upward direction of NAC dopamine concentration. This implies that
- aversive value and APEs are encoded in other brain regions.
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571 MATERIALS & METHODS

572 Animals

573 Adult male Long-Evans rats (300-400 g) were housed individually and kept on a reversed light-dark

- 574 cycle (light on from 20:00 till 8:00) with controlled temperature and humidity. All animal procedures
- 575 were in accordance with the Dutch and European laws and approved by the Animal Experimentation
- 576 Committee of the Royal Netherlands Academy of Arts and Sciences. 37 rats underwent surgery, 21 of
- 577 which exhibited a functional FSCV electrode with a histologically verified location in the NAC, and
- 578 were therefore included in the study. An additional 19 rats, which did not undergo surgery, were used
- 579 for behavioral tasks. All rats were food-restricted to 90% of their free-feeding bodyweight, and water
- 580 was provided *ad libitum*.

581 Stereotaxic surgery

- 582 Rats were induced under isoflurane anesthesia and placed into the stereotaxic frame, on an
- 583 isothermal pad maintaining body temperature. The analgesic Metacam (0.2mg meloxicam/100 g) was
- 584 injected subcutaneously and the shaved scalp was disinfected using 70% ethanol. Upon incision of
- the scalp, it was treated with lidocaine (100 mg/ml). Holes were drilled in the cranium and the dura
- 586 mater was cleared for targeting the NAC (1.2 mm AP, 1.5 mm ML and -7.1 DV). Chronic carbon-fiber
- 587 electrodes (Clark *et al.,* 2010), made in-house, were positioned in the NAC, and an Ag/AgCl reference
- 588 electrode was placed in a separate part of the forebrain. The electrodes were secured to screws in the
- 589 skull using cranioplastic cement. Following surgery, rats received subcutaneous injection of 2 ml
- saline, and were placed in a temperature-controlled cabinet to be monitored for an hour. Rats were
- 591 given 1-2 weeks post-surgery to recover before food restriction, behavioral training, and recording.

592 Behavioral procedures

593 All behavioral experiments, except the real-time place preference task, were conducted in modified 594 operant boxes (32 x 30 x 29 cm, Med Associates Inc.), equipped with a food magazine (connected to 595 an automated food-pellet dispenser) flanked by two retractable levers (with cue lights), a house light,

multiple tone generators, two WN generators, and metal grid floors (Med Associates Inc.). Each
operant box was surveilled by a video camera. The boxes were housed in metal Faraday cages, that
were insulated with sound-absorbing polyurethane foam. An overview of experiments, animal
numbers, and read-outs is provided in Supplementary Table 1.

600 Real-time place preference

601 Rats (n = 10) were placed for 30 minutes in a light-shielded, square, Perspex open field (60x60x60) 602 cm), made in-house (Netherlands Institute for Neuroscience (NIN) mechanical workshop), A camera 603 mounted in the center above the open field recorded the position of the rat, which was tracked in real-604 time by the open-source software Bonsai (Lopes et al., 2015). One guadrant (randomly assigned for 605 each rat) of the open field was paired with exposure to 90-dB WN, which was produced by a WN 606 generator from Med-Associates Inc., mounted on top of one of the open-field walls. WN was 607 automatically switched on as long as the head of the rat was present in the chosen guadrant, and 608 switched off as soon as the rat exited the quadrant. The WN-quadrant position was fixed throughout 609 the session. The percentage of time rats spent in the WN-paired quadrant was compared to chance 610 level (25%).

611 WN and reward choice task

612 Rats (n = 6) were trained to press one of the two levers in the operant box to receive food-pellet 613 rewards (Dustless precision pellets, 45 mg, Bio-Serv). During the first training days, a single lever was 614 inserted at variable inter-trial intervals. Pressing this lever prompted delivery of a single food pellet 615 and immediate retraction of the lever. Omissions (no lever press for 10s) resulted in 10s house-light 616 illumination. After reaching a 90% success rate, the other lever was introduced in training sessions 617 that consisted of 20 "forced" trials, in which one of the two levers was presented, followed by 80 618 choice trials where both levers were presented. Any lever press resulted in delivery of a single food 619 pellet and retraction of extended levers (marking the end of the trial). After 5 consecutive sessions 620 with over 90% success rate, we paired reward delivery of one of the levers with simultaneous 5s of 621 90-dB WN exposure. Rats were trained under these contingencies for 5 days (n = 6), after which half 622 of the animals (n = 3) were switched to 96-dB and the other half to 70-dB WN (n = 3). After five 623 sessions, WN intensities were transposed between the two groups of animals for an additional 5 624 sessions, so that every animal received each WN intensity. In each of these WN sessions, animals 625 could earn a maximum of 100 pellets (in 100 trials). Both levers were presented simultaneously at a 626 variable inter-trial-interval averaging 25s (range: 15-35s). Just as at the start of training, one lever 627 press induced immediate retraction of both levers and prompted reward delivery (end of trial), 628 whereas omissions (no press within 10s upon lever insertion) ended the trial and resulted in 10s 629 house-light illumination. We compared the relative number of WN-paired lever presses on the fifth day 630 of training across different WN-intensities.

631 FSCV during aversive Pavlovian conditioning with 90-dB WN

632 On the first day of aversive Pavlovian conditioning, a new group of 16 rats was tethered to the FSCV

- 633 recording equipment and placed in the operant box. In this and all paradigms described below, prior to
- behavioral session start, two unexpected deliveries of a single food pellet (spaced apart by two
- 635 minutes), confirmed electrode viability to detect dopamine. The session started with the illumination of
- the house light. The first 30 trials consisted of the presentation of a 5 s cue (1.5 kHz, 75 dB tone)
- 637 followed by 6 s of WN (90 dB). Trials were separated by a variable inter-trial interval of 60s (range:
- 638 30-90 s). For a subset of the rats (n = 11), these initial 30 trials were followed by 55 trials, in which 5s-
- 639 cue/6s-WN pairings were randomly mixed with four trials with unpredicted WN (6s of 90-dB WN
- 640 without cue), four trials with WN omission (5s-cue without WN), and four trials with 5s-cue followed by
- 641 12s of 90-dB WN (longer-than-expected condition).
- 642 A subset of the initial 16 rats (n = 4) was conditioned for an additional 5 days (days 2-6), of which the
- 643 first 4 days consisted of sessions with 30 trials of pairings of 5s-cue/6s with 90-dB WN, and on the
- 644 fifth day (sixth day of conditioning in total) another FSCV recording session took place (as described
- for day 1). An additional group of animals (n=13), without implanted FSCV electrodes were
- 646 conditioned for 6 days, in order to characterize behavioral responses to different WN intensities.
- 647 For the analysis of the first 30 conditioning trials, we compared the average dopamine concentration 648 during the cue (5 s) and the WN (6 s) epoch to baseline (-5 to 0 s before cue onset). To analyze trials 649 with different contingencies (unpredicted, omitted, or longer WN), we compared average dopamine 650 during the relevant epochs (unpredicted WN: 11-25 s after cue onset; better than predicted (omitted 651 WN): 5-20 s after cue onset; worse than predicted (longer WN): 11-25 s after cue onset) with average 652 dopamine in the respective epochs in immediately preceding trials 5s-cue/6s-WN pairings (trials 25-653 30), during which dopamine decreases had stabilized and were unaffected by different contingencies. 654 Slopes of dopamine traces were compared between trials with different contingencies and predicted 655 WN trials since using the slope allows for integration of the change in dopamine concentration over 656 time, as opposed to averaging concentrations over an epoch (in which there is no integration over 657 time). All traces were aligned before WN onset.
- 658 To compare dopamine concentration during cue and WN between days 1 and 6 and to 659 quantify the shift of dopamine release from the US to the CS, we subdivided the results of day 1 into 660 "day 1 (early)" (trials 2-4; trial 1 was excluded to remove the saliency response to the first cue 661 exposure) and "day 1 (late)" (trials 5-30). We calculated the ratio between US and CS dopamine 662 signals as a deviation from baseline (in the respective up or down direction). For aversive 663 conditioning, this ratio was determined by (area above the curve of the WN epoch)/(area above the 664 curve of the cue epoch). For appetitive conditioning, this ratio was determined by (area under the 665 curve of the pellet epoch)/(area under the curve of the cue epoch).

666 Appetitive Pavlovian conditioning

Rats (n = 10) were placed in the operant box, and on days 1 and 6, they were tethered to the FSCV
 recording equipment. Illumination of the house light signaled the beginning of the session. Sessions

consisted of 40 pairings of cue-light illumination (5 s) with a pellet delivery (delivered immediately after
 cue offset), which were separated by variable inter-trial-intervals averaging 60 s (range: 30-90 s).

671 WN dose response

672 Rats (n = 6) were tethered to the FSCV recording equipment and placed into the operant box. The 673 two WN generators with custom-made volume control dials (NIN mechanical workshop) were used to 674 switch between different WN intensities. The FSCV recording session consisted of 6 blocks in which 675 two different WN intensities (70, 80, 90 or 96 dB) were presented for 6 s in random order, 4 times 676 each, with a variable inter-trial-interval averaging 30 s (range: 25-35 s). Between blocks, the volume 677 dial was used to change WN intensities. During the different blocks, all WN intensities were presented 678 in pairs of two and, therefore, each intensity was presented in 3 of the 6 blocks and played 12 times in 679 total. We compared the average dopamine concentration during the WN exposures between the 680 different intensities.

An additional group of rats (n=13), without implanted FSCV electrodes, were placed into an operant box and underwent WN exposure in order to characterize behavioral responses to the four different WN intensities (70, 80, 90 or 96dB; randomly ordered in blocks of 15 trials) presented for a duration of 6s per trial, followed by an average variable inter-trial interval of 60s (range: 30-90 s). Before the start of each block, 3 food pellets were delivered with a variable inter-trial interval averaging 30 s (range 20-40). We compared the average baseline-subtracted locomotion speed of the animals during the WN exposures between the different intensities.

688 Aversive Pavlovian conditioning with 80-dB and 96-dB WN

689 Rats (n = 9) underwent 4 aversive conditioning sessions in the operant box in which a 2 kHz and 8 690 kHz tone (5 s cue) predicted the exposure to 80-dB or 96-dB WN (6 s), respectively. Sessions 691 consisted of 88 trials, of which 40 trials with 80-dB WN and 40 trials with 96-dB WN, predicted by their 692 respective cues, were presented in random order. In the remaining 8 trials, an unpredicted food pellet 693 was delivered. These deliveries were distributed across the session so that in every block of 10 WN 694 exposures, one pellet was delivered at a random trial number. Trials were separated by variable inter-695 trial-intervals averaging 60 s (range: 30-90 s). On the fourth conditioning day, a recording session 696 took place, for which the rats were connected to the FSCV recording equipment. We compared 697 average dopamine concentrations during the cue (5 s) and during the WN (6 s) epochs.

- During the subsequent 4 aversive conditioning sessions, we changed the probability of exposure to
- 699 80-dB and 96-dB WN following their associated cues. The total number of presentations of tone 1,
- tone 2, WN, and pellet deliveries remained the same. However, tone 1 was now followed by 80-dB
- WN (6 s) in 75% of the trials and by 96-dB WN (6 s) during the remaining 25% of the trials. Tone 2
- was followed by 96-dB WN (6 s) in 75% of the trials and 80-dB WN (6 s) during 25% of the trials. A
- recording session took place on the fourth conditioning day. We compared the average dopamine
- concentrations during the cue (5 s) and WN (6 s) epochs.

705 Concurrent reward and WN, and cue extinction

Rats (n = 6) were connected to the recording set up and placed in the operant box. The conditioning session began with 10 pairings of the 5-s cue (1.5 kHz tone) and 6 s WN (90dB). Next, followed a block of 20 trials pairing the 5-s cue and 24 s of WN; during half of these trials (randomized) a pellet was delivered 6 s into the WN exposure. The recording session was concluded with a block of 20 extinction trials, in which only the 5s cue was delivered. This recording session was the last to take place, the rats had experienced 9-11 conditioning sessions prior to this recording.

712 FSCV measurements and analysis

713 As described previously (Willuhn et al., 2014a), fast-scan cyclic voltammetry (FSCV) was used to 714 detect subsecond changes in extracellular concentration of dopamine using chronically implanted 715 carbon-fiber microsensors that were connected to a head-mounted voltammetric amplifier, interfaced 716 with a PC-driven data-acquisition and analysis system (National Instruments) through an electrical 717 commutator (Crist), which was mounted above the test chamber. Every 100 ms, voltammetric scans 718 were repeated to achieve a sampling rate of 10 Hz. The electrical potential of the carbon-fiber 719 electrode was linearly ramped from -0.4 V versus Ag/AgCl to +1.3 V (anodic sweep) and back 720 (cathodic sweep) at 400V/s (8.5 ms total scan time) during each voltammetric scan, and held at -0.4 V 721 between scans. Dopamine is oxidized during the anodic sweep, if present at the surface of the 722 electrode, forming dopamine-o-quinone (peak reaction detected around +0.7 V), which is reduced 723 back to dopamine in the cathodic sweep (peak reaction detected around -0.3 V). The ensuing flux of 724 electrons is measured as current and is directly proportional to the number of molecules that undergo 725 electrolysis. The background-subtracted, time-resolved current obtained from each scan provides a 726 chemical signature characteristic of the analyte, allowing resolution of dopamine from other 727 substances (Phillips & Wightman, 2003). Chemometric analysis with a standard training set was used 728 to isolate dopamine from the voltammetric signal (Clark et al., 2010). All data was smoothed with a 729 moving 10-point median filter and baseline (set at 1 s before cue onset or in case of an absent cue 1s 730 before WN onset) subtraction was performed on a trial-by-trial basis prior to analysis of average 731 concentration. Analyses were performed on dopamine concentration during cue (5 s) and WN (6 s) 732 epochs and were compared to baseline dopamine concentrations or to the same epoch in a different 733 experimental condition. Prior to each FSCV recording session, two unexpected deliveries of a single 734 food pellet (spaced apart by two minutes) confirmed electrode viability to detect dopamine. Animals 735 were excluded from analysis when: 1) A lack of dopamine release in response to unexpected pellets 736 before start of the behavioral session, 2) FSCV recording amplitude background noise that was larger 737 than 1nA in amplitude.

738 Analysis of operant-box behavior

DeepLabCut software (Mathis *et al.*, 2018) was used to track rat movement in the operant box using
video data recorded during FSCV measurements. This tracking data was analyzed in MATLAB (The
Mathworks, Inc. Version 2019a) to determine distance to the reward magazine and speed of

- 742 movement (cm / s). Analyses were performed using the average distance or locomotion speed during
- the cue (5 s) or WN (6 s) epochs. During the WN- and reward-choice task, the number of presses on
- each lever was registered via an automated procedure.
- 745

746 Histological verification of recording sites

- 747 After completion of the experiments, rats were deeply anesthetized using a lethal dose of
- 748 pentobarbital. Recording sites were marked with an electrolytic lesion before transcardial perfusion
- 749 with saline, followed by 4% paraformaldehyde (PFA). Brains were removed and post-fixed in PFA for
- 750 24 hours after which they were placed in 30% sucrose for cryoprotection. The brains were rapidly
- frozen using an isopentane bath, sliced on a cryostat (50 µm coronal sections, -20°C), and stained
- 752 with cresyl violet.

753 Statistical analysis

- FSCV and behavioral data were analyzed using one- or two-tailed paired or unpaired t-tests, repeated
- 755 measures ANOVAs, regression analysis, or their nonparametric equivalents when appropriate. Post-
- hoc analyses were conducted when necessary and p-values were adjusted when multiple
- comparisons were made. Statistical analyses were performed using Prism (Graphpad software) and
- 758 SPSS statistics version 25.0 (IBM); graphical representations were made using Prism. Statistical
- significance was set to p < 0.05. Sample size was not explicitly determined by a power analysis when
- the study was being designed, but was, instead, based on the lab's experience with this type of data.

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764 COMPETING INTERESTS

765 The authors declare that no competing interests exist.

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957

958 Supplementary Table 1

Experiment	N	FSCV readout	Behavioral readout
Real time place preference (Fig 1A)	10		Х
WN and reward choice task (Fig 1B)	6		Х
Aversive Pavlovian conditioning day 1 - First 30 trials (Fig 2A, B and C) - Mix trials (Fig 3D, E and F)	16 11	X X	х
Appetitive Pavlovian conditioning (Fig 2B and C)	10	Х	Х
Aversive Pavlovian conditioning days 2 – 6 (Fig 2B and C)	4 13	Х	X X
Dose response (Fig 2E and F)	6 13	Х	X X
Deterministic experiment (Fig 2G)	9	Х	
Probabilistic experiment (Fig 3A, B and C)	9	Х	
Concurrent reward & WN and extinction (Fig 2D, 3G and H)	6	Х	