



#### **REVIEW**

# Recent advances in understanding the role of phasic dopamine activity

Wolfram Schultz (1)

Department of Physiology, Development and Neuroscience, University of Cambridge, Cambridge, CB2 3DY, UK

#### **Abstract**

The latest animal neurophysiology has revealed that the dopamine reward prediction error signal drives neuronal learning in addition to behavioral learning and reflects subjective reward representations beyond explicit contingency. The signal complies with formal economic concepts and functions in real-world consumer choice and social interaction. An early response component is influenced by physical impact, reward environment, and novelty but does not fully code prediction error. Some dopamine neurons are activated by aversive stimuli, which may reflect physical stimulus impact or true aversiveness, but they do not seem to code general negative value or aversive prediction error. The reward prediction error signal is complemented by distinct, heterogeneous, smaller and slower changes reflecting sensory and motor contributors to behavioral activation, such as substantial movement (as opposed to precise motor control), reward expectation, spatial choice, vigor, and motivation. The different dopamine signals seem to defy a simple unifying concept and should be distinguished to better understand phasic dopamine functions.

#### **Keywords**

reward, prediction, learning, aversive, movement

Corresponding author: Wolfram Schultz (ws234@cam.ac.uk)

Author roles: Schultz W: Conceptualization, Funding Acquisition, Writing - Original Draft Preparation, Writing - Review & Editing

Competing interests: No competing interests were disclosed.

Grant information: This work was funded by the Wellcome Trust (grant WT 204811).

The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Copyright: © 2019 Schultz W. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

How to cite this article: Schultz W. Recent advances in understanding the role of phasic dopamine activity [version 1; peer review: 3 approved] F1000Research 2019, 8(F1000 Faculty Rev):1680 (https://doi.org/10.12688/f1000research.19793.1)

First published: 24 Sep 2019, 8(F1000 Faculty Rev):1680 (https://doi.org/10.12688/f1000research.19793.1)

#### Introduction

The question "What is dopamine doing?" keeps stubbornly popping up after the discovery of the brain's dopamine system and its relationships to Parkinson's disease, psychosis, and drug addiction. Although the efficacy of dopamine receptorstimulating drugs in alleviating Parkinsonian movement disorders pointed initially to a mere tonic, modulatory role, it became increasingly clear that dopamine is a neurotransmitter not unlike other transmitters and has its own synapses and phasic activity related to stimuli and actions. The ensuing research efforts revealed an amazing array of heterogeneous functions at various time courses and levels of specificity that range from general behavioral activation to precise reward signaling for biological learning, machine learning, and economic choice1. The complexity defies the notion of "one neuronal system equals one function" but likely reflects the workings of an evolutionarily ancient system that governs the individual's requirements for survival.

This overview describes further conceptual, biological, and economic characterizations of the dopamine reward signal in animals from the past few years, its involvement in social processes, and its distinction from aversive, novelty, sensory, and motor processing. I will follow the notion that the function of an information-processing system can be defined by the relationship of its internal signals to behavior. This knowledge would provide a firm basis for investigating molecular, cellular, and circuit mechanisms. However, detailed descriptions of the recently elucidated fine network properties of dopamine neurons would exceed the topic and limits of this brief review,

nor will I be able to discuss molecular signaling, human brain signals, and effects of lesions and systemic dopaminergic drugs that indicate tonic permissive rather than phasic driving influences.

## Further characterization of the reward prediction error signal

Rather than coding rewards and reward-predicting stimuli as they appear in the environment, phasic, sub-second responses in the majority of midbrain dopamine neurons code a reward prediction error. Their activity is increased for one hundred or two hundred milliseconds when a reward or reward-predicting stimulus is better than predicted, their activity is unchanged when these events have the same reward value as their prediction, and their activity is briefly depressed when these events have lower reward value than predicted.

#### Rewarding effect of dopamine neuron stimulation

Electrical or optical stimulation of dopamine neurons serves as a teaching signal for lever pressing, nose poking, place preference, unblocking, and prevention of extinction<sup>2–6</sup>; conversely, optogenetic dopamine inhibition induces place avoidance and behavioral inhibition<sup>7–9</sup>. These behavioral effects likely reflect the elicitation of positive and negative reward prediction error signals, respectively. Recent research shows that these behavioral learning functions extend to neuronal learning: monkey dopamine neurons acquire stronger responses to an intrinsically neutral visual stimulus that is followed by optogenetic dopamine stimulation added to juice reward, as compared with a stimulus associated with only that reward (Figure 1A, B)<sup>10</sup>. Concomitantly, the animal develops choice preference over

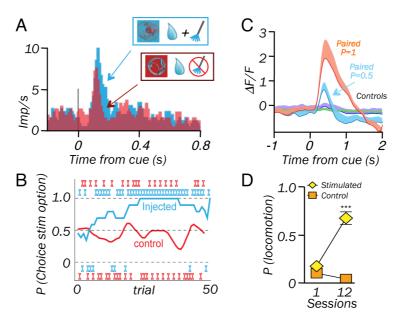


Figure 1. Optogenetic dopamine excitation elicits neuronal learning in dopamine neurons. (A) Increased stimulus response after optogenetic dopamine excitation added to reward (identical juice after each stimulus). Adapted from Stauffer *et al.*<sup>10</sup> Figure 5.C, CC BY 4.0. (B) Behavioral learning: gradual increase of choice probability between the two stimuli. Ticks indicate choices in channelrhodopsin-injected animals (blue) and non-injected controls (red). Adapted from Stauffer *et al.*<sup>10</sup> Figure 6.B, CC BY 4.0. (C) Graded neuronal learning in rats induced by dopamine excitation at reward time. P = probability of excitation per stimulus appearance<sup>11</sup>. (D) Behavioral learning: acquisition of locomotion following the stimulus associated with optogenetic excitation<sup>11</sup>.

20 to 25 repetitions for the stimulation-associated fractal over an alternative, non-stimulated fractal, even without natural reward. In rats, optogenetic dopamine excitation at the time of reward induces dopamine responses to the stimulus along with driving approach and locomotion (Figure 1C, D)<sup>11</sup>. In a further step, dopamine stimulation serves as reward for operantly controlling cortical firing patterns<sup>12</sup>. These effects together support the hypothesis that bidirectional dopamine reward prediction error responses influence neuronal and behavioral learning.

# Dopamine neurons access reward predictions without explicit association

Standard reward learning paradigms rely on the contingent association with a stimulus, whereas higher learning theories postulate a role for representations beyond explicit reward contingency. Dopamine neurons follow this latter notion<sup>13</sup>: during sensory preconditioning, two stimuli (A and B) are first presented sequentially. Then reward occurs only with the later stimulus presented alone (B). Then the earlier stimulus (A) is tested for reward prediction. Indeed, dopamine neurons are activated by the test stimulus (A) although it had never been explicitly paired with the reward. Thus, the neurons access a reward representation via the test stimulus (A) that had earlier been associated with the then-unrewarded stimulus (B), defying the simple requirement for direct stimulus—reward contingency.

### Prediction error responses reveal what's on dopamine's mind

The reward prediction error response depends on both the reward and the prediction: reward received minus reward predicted. If we know the reward and measure the dopamine response, we can infer the prediction the neuron is accessing.

The idea started with a stimulus sequence that always ends with a reward after a short but random number of steps. A monkey registering only repeated reward omissions would expect progressively less reward, but with experience it would know the reward would come more likely the longer the wait is (increasing hazard rate). Thus, with longer waiting, reward prediction increases and the error when the reward occurs decreases. Indeed, the dopamine response to the reward decreased during waiting, indicating that the neurons accessed the temporally increasing reward prediction derived from the overall task experience (rather than a decreasing prediction derived from the repeating reward omissions)14. A recent experiment confirmed this result in mice but tested also slightly uncertain rewards (probability of P = 0.9). Here, the animal never knew for sure whether the reward would ultimately come and might increasingly expect none as time advances (like humans giving up waiting for an unreliable bus). But when the reward does occur, the prediction error and the dopamine response are higher the longer the wait was<sup>15</sup>. Thus, the dopamine response reflects access to reward predictions that are inferred from the temporal structure of reward probabilities rather than deriving entirely from the occurrence or omission of last rewards. Interestingly, rewardpredicting responses in amygdala reflect also temporal reward

probability<sup>16</sup>, indicating that reward neurons in general may access more sophisticated reward representations than hitherto assumed.

Reward predictions accessed by dopamine neurons derive from probability distributions of reward amounts. A larger reward compared with the expected value (predicted mean) of a predicted distribution activates dopamine neurons in monkeys, and a smaller reward induces a depression<sup>17-20</sup>. Dopamine responses change their gain depending on the variance of the distribution<sup>21</sup>, suggesting access to at least the first two statistical moments of distributions. By contrast, with a predicted distribution of only two fixed reward amounts, something unexpected happens in mice: there is no response when either of the two predicted rewards occurs but a graded response in rare probe trials that tends to increase with the absolute difference to each of the two predicted rewards; the response is positive for amounts slightly above the lower reward, negative for amounts slightly below the upper reward, and zero for amounts right between the two rewards<sup>22</sup>. For an intuitive example, imagine a restaurant with two randomly alternating chefs with widely different ability: when the food is almost but not quite spectacular, we realize the good chef was cooking but may have overlooked something, thus generating a negative prediction error (relative to the predicted superb meal from that chef), even though the food was better than from the other chef and above the mean from both chefs. Thus, dopamine neurons access rich reward probability distributions via their statistical moments but can access individual elements when distributions are very restricted. As seen during waiting<sup>14,15</sup> and reward reversal<sup>23</sup>, the reward predictions accessed by dopamine neurons derive not only from recent rewards but also from the overall reward structure of the environment

Perceptual choices help to further reveal what's on dopamine's mind. Dopamine responses to a set of choice options reflect the animal's future choice. When a monkey chooses the more frequently rewarded option, the stimulus response is stronger compared with choosing the less often rewarded option, despite identical option presentation. As reward probability constitutes value, the neurons code "chosen value" (that is, the value of the option the animal chooses) rather than the mean value of all options<sup>24,25</sup>. The chosen value response occurs to the stimulus and partly precedes and thus predicts the choice. In these straightforward tests, the animal chooses, with some stochasticity, between values that are firmly associated with the options. By contrast, in perceptual random-dot motion choice tasks, the value depends on the animal's discrimination of motion direction, and the reward probabilities are not firmly associated with constant, unequivocally marked options. Higher motion coherence allows better discrimination and thus increases the probability of getting a reward. Thus, with higher coherence, reward value increases monotonically when choosing the correct motion direction but decreases monotonically when choosing the opposite, incorrect direction. Dopamine neurons in monkeys and mice show exactly this graded chosen value response during random-dot motion and contrast detection

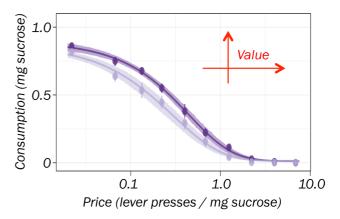
tasks<sup>26,27</sup>. The value responses before each choice derive from the combination of the animal's stimulus assessment and the subjective probability of making a correct discrimination ("subjective" in the sense of perception rather than individual economic probability weighing). As the targets are not distinctly marked for value, the responses cannot simply reflect the experienced reward probability for a given target.

Taken together, dopamine neurons have access to representations of future rewards that not only are associated with explicit stimuli but also derive from environmental factors like context, task structure, and time. These internal representations may be more globally called belief states and, when they reflect prior probabilities, Bayesian belief states<sup>22,26</sup>. These representations or beliefs are parts of reward predictions that affect dopamine neurons, which report their deviation from the actual obtained primary and conditioned rewards as "reward prediction error".

#### **Neuroeconomics**

Rewards don't exist; they are made up by our minds. The third steak during a dinner is not attractive although it is pretty similar to the first two appetizing steaks. Plenty of other examples confirm that reward value is subjective and depends on non-physical factors like satiety, delay, and risk. While we can forever test individual cases of subjective value, economic theory provides concepts for understanding subjective value and preferences and predicting behavioral choices under various conditions, including risk. An example is the utility signal of dopamine neurons that transcends the ad-hoc coding of subjective value<sup>19</sup>. This neuronal result aligns biological reward to economic choice and constitutes a prerequisite for understanding how individuals maximize utility for momentary and evolutionary benefit.

But what would a dopamine signal for such a theoretical decision variable do in a real-world scenario? One of the most intuitive and reliable phenomena in economics is the pricedemand relationship. As the price goes up, consumption goes down; people buy less stuff when it gets more expensive. But if the good becomes more valuable, demand increases, which shifts price-demand curves to the right. Price can be modeled as number of lever presses in rats, and value can be enhanced by dopamine stimulation, although further known factors affecting consumption may be too extensive for an initial, well-controlled study, such as availability of alternatives, time, and effort. How then would a dopamine economic value (utility) signal affect consumer choice? Indeed, inducing a positive dopamine reward prediction error signal by optogenetic excitation at the reward shifts the curves upward and rightward, indicating that the stimulation enhances value, thereby increasing demand at same price and maintaining same consumption despite higher price (Figure 2)28. Stimulation at the rewardpredicting cue has the opposite effect (by lowering reward value due to a negative prediction error elicited by the reward following the enhanced value prediction). This wellconceptualized situation, even with the restrictions imposed on an initial study, demonstrates that the dopamine utility



**Figure 2. Optogenetic dopamine stimulation enhances consumer value.** Dopamine stimulation induces rats to consume more sucrose for the same price (lever press per pellet, vertical arrow) and maintain the same consumption despite increasing price (horizontal arrows), reflecting the value increase by the stimulation-elicited positive reward prediction error signal. Light blue: without stimulation; dark blue: with stimulation at reward time<sup>28</sup>.

signal has a very practical application; it affects daily consumer choice by influencing the value of a good. This beautiful result, outside the beaten path, suggests many follow-up experiments.

#### Social settings: valuing own and other's reward

Rewards are fine for me but may not be so great when somebody else receives them instead of me. Monkeys see it the same way; they value rewards more when they occur more frequently for themselves but not so much when they occur for another monkey, as shown by licking and binary choice. Dopamine neurons follow this social reward valuation; higher probability of own water reward elicits stronger responses, confirming standard reward value coding, whereas higher reward probability for the other monkey reduces own dopamine responses<sup>29</sup>. It seems that this disadvantageous reward inequity has negative reward value for dopamine neurons. Thus, dopamine neurons register everybody's rewards but value them only relative to their host. Their primary concern with own reward resembles that of most reward neurons in the striatum<sup>30</sup>, some of which sense disadvantageous reward inequity<sup>31</sup>.

# The dopamine prediction error signal: purely reward? A response that is only a component

Environmental rewards and reward-predicting stimuli contain a non-value component that impacts on sensory receptors, but their identification and evaluation take a few tens or hundreds of milliseconds. Dopamine neurons, in analogy to other neuronal systems, show an early unselective activation, which reflects sensory detection of the stimulus<sup>32</sup> and constitutes a default signal for any potential reward in the environment; it is quickly replaced, before any behavioral action, by the subsequent prediction error component that codes reward value<sup>19,33-35</sup>; recent studies confirm this notion<sup>36</sup>. Thus, the initial,

non-reward activation constitutes an integral part of the dopamine reward response. Its identification requires temporal resolution in the ten-millisecond range and is often difficult, in particular with unrewarded, value-less stimuli not allowing independent variation of sensory and reward parameters.

Several factors affect the initial, sensory dopamine activation. First, it increases with physical impact and salience, irrespective of reward or aversive value<sup>34</sup>. Second, it is elicited and enhanced by neutral or punishment-predicting stimuli that resemble rewards or occur in rewarding contexts<sup>37–39</sup>. Finally, it occurs with novel stimuli in humans, monkeys, and mice<sup>25,40–42</sup>. The novelty component decays during conditioning (due to repetition), whereas the reward-predicting component increases<sup>25,42</sup>. The unpredicted occurrence of an unrewarded picture and positive sensory prediction errors enhance the initial-component response but, in contrast to bidirectional reward prediction error coding, picture omission does not seem to elicit a dopamine depression in monkeys and rats<sup>33,38,43</sup> (Figure 3A–D). Thus, the initial dopamine response component seems to code

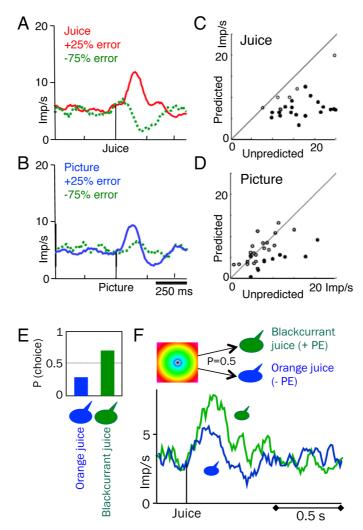


Figure 3. Surprise salience coding with non-rewarding stimuli contrasts with reward prediction error coding. (A) Bidirectional prediction error coding for juice reward. The animal received juice reward in 75% of trials but not in 25% of trials. Hence, a reward that did occur generated a 25% positive prediction error, and an omitted reward generated a 75% negative prediction error. (B) With similar 75 to 25% presentation of non-rewarding arbitrary (fractal) picture, unidirectional response enhancement with surprising picture occurrence (+25% picture prediction error), without negative error coding with picture omission (-75% picture error). (C) Reward response increase with unpredicted reward delivery (compatible with positive reward prediction error coding). Closed circles indicate significant differences (*P*<0.05; *t* test). (D) Smaller response enhancement with unpredicted picture occurrence, reflecting surprise salience. A–D are reused from Kobayashi and Schultz<sup>38</sup> Figure 4 (A, B, E, F), CC BY 3.0. (E) Preference for blackcurrant over orange juice in binary, simultaneous choice (same liquid amounts), indicating higher value of blackcurrant than orange juice<sup>18</sup>. (F) Dopamine prediction error response for juice identity reflects reward value. The concentric stimulus predicts equiprobable delivery of either blackcurrant or orange juice; the neuronal response reflects the prediction error between the value of the received juice and the stimulus-predicted mean value of the two juices (green: positive; blue: negative, with initial-component activation)<sup>18</sup>.

surprise salience rather than a full, bidirectional prediction error. In contrast to the initial sensory component, delivery of different juices with different sensory attributes elicits a bidirectional reward prediction error response that reflects the value of the juices (Figure 3E, F).

#### Aversive responses

For 40 years, many studies, including our own, reported activations by aversive stimuli in some dopamine neurons (for references, see 35). However, aversive events contain several components, as do rewards, and their dissociation concluded that dopamine activations by aversive stimuli reflect physical impact (first component) rather than aversiveness<sup>34</sup>; aversiveness is coded not at all<sup>34</sup> or as depression of activity reflecting negative reward value (second component)44,45. Dopamine reward neurons are also activated by negative punishment prediction error, which has positive value (double negative)39,45,46, by rebound from aversive depression<sup>34,45</sup>, and by prediction of relief from punishment<sup>45-47</sup>, which is rewarding<sup>48,49</sup>. Thus, some of the recently reported activations by aversive air puff, sound, and foot shock44,45 might reflect rewarding relief from the threat these stimuli might pose to the animals, even if these neurons do not code standard reward.

In contrast to these reward responses, recent studies report activations in dopamine subgroups in lateral substantia nigra, striatum tail, and ventro-medial nucleus accumbens shell in response to air puff, intense sound, and foot shock but not with physically less intense aversive quinine nor much with reward<sup>42,44,45</sup>. These responses may reflect physical impact or aversion or both. The foot shock activation transfers to predictive stimuli during learning in ventro-medial nucleus accumbens shell<sup>45</sup>. This result would refute a possible relation to physical impact, which is unchanged, but it might also reflect temporal surprise salience; it might even indicate transfer of an early-component sensory impact response in analogy to the known transfer of the subsequent value component. Nonetheless, these neurons differ in molecular and physiological properties and have striatal projection territories different from those of the typical, straightforward reward-processing dopamine neurons<sup>44,45</sup>. Foot shock omission fails to elicit depressions in these dopamine neurons<sup>45</sup>; this lack of bidirectional prediction error coding would make an involvement in reinforcement learning less direct. Furthermore, optogenetic excitation of dopamine axons in striatum tail elicits behavioral aversion<sup>44</sup>, indicating a truly aversive function (though without completely mimicking the brain's mechanics of natural excitation). The physically less intense quinine is ineffective despite its behavioral aversiveness44, which argues for a contribution of physical impact and against general negative value coding.

Thus, if physical impact remains an option for explaining activations by aversive stimuli, we might be dealing with the opposite tails of two continuous probability distributions: one for physical impact and one for value. Then dopamine neurons with activations by aversive stimuli might lie at the high end of the physical impact distribution, and their weak reward coding would be at the low end of the value distribution. On the

other hand, despite all the caveats, optogenetics may have uncovered groups of dopamine neurons that are truly activated by specific punishers and thus differ qualitatively from reward-processing dopamine neurons<sup>45</sup>, after 40 years of trying to nail them. If so, they might be parts of an ancient system detecting fear (of air puff, intense sound, foot shock, and novelty) rather than disgust (quinine)<sup>44</sup> and contrast with the abundant reward-coding dopamine neurons that are depressed by aversive stimuli and code outcome value monotonically from negative to positive<sup>39,44</sup>. Dopamine neurons in fruit flies show similar response diversity—about 130 neurons code reward and 12 neurons code punishment<sup>50</sup> suggesting preservation across a huge evolutionary range. So, ten years from now, will we know whether the dopamine activations by aversive stimuli reflect physical impact or aversiveness or maybe both?

#### **Behavioral activation**

Even though the common assumption of one brain system equals one function may not hold for dopamine<sup>1</sup>, such multifunctionality seems perplexing and gives rise to the question "What is dopamine doing?"

#### Movement or not movement

The earliest behavioral studies of midbrain dopamine neurons and striatal dopamine concentrations in monkeys and rats report heterogeneous activations and depressions for a second or more with movements<sup>51-55</sup>. Dopamine changes are associated with task events such as large contralateral or ipsilateral arm reaching movements (16-44% and 15-17% of neurons, respectively), self-initiated arm movements (12%), reward delivery and mouth movements (9%), and full trial duration (5%). However, such changes are absent with more concise movements, such as well-controlled arm flexion-extension<sup>56</sup>, stereotyped reaching<sup>41</sup>, sluggish reaching elicited by offset of a stimulus<sup>57</sup>, and spontaneous and stimulus-driven eye movements<sup>57</sup>. The monitoring of large numbers of individual muscles in monkeys (Figure 4) shows that these heterogeneous dopamine changes are unrelated to specific movements or motor control but reflect the behavioral activation underlying large movements, derived from the activity of many muscles<sup>55,57,58</sup> and of sensory receptors in muscle, joint, and skin associated with such movements, a global process that might also be called vigor or even motivation.

#### Movement activation

The advent of dopamine voltammetry, molecular identification, optogenetics, and optical recording allows us to further characterize these behavior-related changes, associate them with different neuronal populations and their projection territories, and distinguish them from reward prediction error responses. Recent studies describe dopamine changes when rodents move in open fields, small chambers, levers, nose poke ports, T-mazes, running wheels, and trackballs<sup>6,59-68</sup>, whereas specific motor processes engaging only few muscles are ineffective<sup>69</sup>. The dopamine changes are heterogeneous in terms of timing during test trials, behavioral variable being encoded, and midbrain location. Thus, early in each trial, activity in distinct dopamine neurons varies with different movement parameters

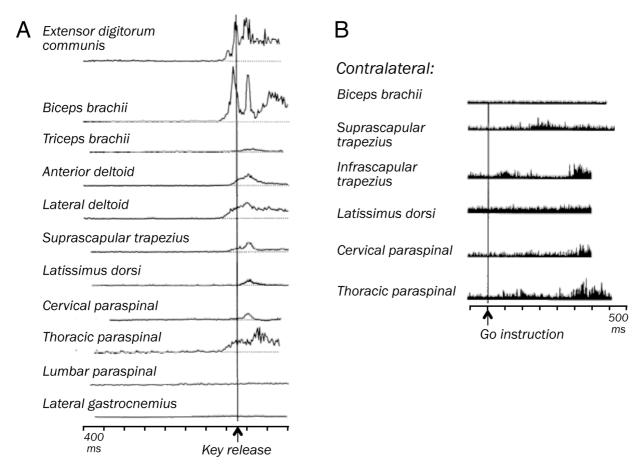


Figure 4. Monitoring of muscle activation during unilateral reaching in macaque monkeys. (A) Activity in forearm, upper arm, shoulder, back, and leg muscles during self-initiated arm movements (rectified electromyograms). Some midbrain dopamine neurons show slow activations before (12%) and during (16%) these movements. From Romo and Schultz<sup>55</sup>. (B) Activity even in contralateral muscles during instructed, stimulus-triggered arm reaching movements. From Schultz and Romo<sup>70</sup> with permission from Springer Nature, RightsLink License Number: 4662430242555.

like speed and acceleration, whereas at trial end more neurons code mouth movement or reward<sup>68</sup>. While some studies provide fine-grained statistical dissociation<sup>68</sup>, some of the effective behavioral variables, like reward expectation leading to faster movement and movement speed reflecting vigor and motivation, might be intercorrelated; indeed, a common variable underlying these behaviors might be arousal and general behavioral activation. The molecular, cellular, and input heterogeneity of dopamine neuron groups and the differential projection topography between midbrain and striatum<sup>71–73</sup> would allow specific dopamine influences on particular postsynaptic targets. Correspondingly, optogenetic dopamine excitation elicits locomotion and biases choice depending on the midbrain region being stimulated, whereas inhibition elicits opposite effects<sup>61,64,65</sup>, suggesting an active behavioral role of the observed dopamine changes (even without knowing the animal's "feeling" when receiving a dopamine shock without accompanying sensory or motor cortex activity). By contrast, some motivation-related changes in striatal

dopamine concentration are not associated with dopamine impulse changes in the soma<sup>67</sup> and may derive from local presynaptic influences that have long been recognized<sup>74,75</sup>. (As with other neurotransmitter systems, dopamine function depends on transmitter release and postsynaptic receptors in addition to the temporally precise impulse responses.)

#### Comparison with reward prediction error coding

The amazing spectrum and heterogeneity of dopamine relationships to behavioral activation contrast with the rather stereotyped reward prediction error response that varies across neurons in only a single scalar parameter<sup>36</sup>. The prediction error response stands out more; it is more phasic and has a higher instantaneous impulse rate and a shorter duration than the changes related to behavioral activation. These differences are particularly evident with the high temporal resolution of neurophysiological impulse responses. Nevertheless, the detection of prediction error responses requires explicit events that allow to identify predictions and to subtract their value from that

of the reward. Analyses using reinforcement models help to further identify dopamine prediction error responses in elaborate tasks<sup>64,76</sup>.

How might these seemingly separate modes of dopamine action relate to each other? Despite attempts to derive a common activational role<sup>77</sup>, it is currently unclear how the heterogeneous relationships to behavioral activation might emerge from prediction error coding. One may dissociate the behavioral activation from prediction error coding by their respective spatial and non-spatial specificity78 or explain the dopamine voltammetry signal during movement and reward expectation by prediction error coding<sup>79-81</sup>, or behavioral activation and reward prediction error might be coded in different dopamine groups. In rodents, movement relationships are more frequent in substantia nigra dopamine neurons and their striatum-projecting regions, whereas reward prediction error coding is abundant in ventral tegmental area neurons and their nucleus accumbens projection<sup>6,62,67,68</sup>. These differences are gradual and do not constitute the strong medio-lateral midbrain or the ventro-dorsal striatum dichotomy seen in regional lesion experiments. Similar graded, rather than strict, differences are seen in monkeys, whose dopamine neurons in substantia nigra signal reward less f requently (<60%) than in ventral tegmental area (>70-80%)<sup>41,82</sup>; in corresponding striatal projection territories, reward expectation affects 40 to 50% of caudate and anterior putamen neurons and more than 75% of nucleus accumbens neurons83.

#### Multiple dopamine functions

Thus, the notion of one neuronal system having exactly one function may not be valid for dopamine neurons, however hard we try. Maybe such an evolutionarily ancient system, which exists already in fruit flies, has multiple functions that are difficult to capture in a single term. A common denominator for the role of phasic dopamine activity might be to get the animal what it needs to survive, like detecting reward and coding the action for obtaining it (the two key components of motivation), although that sounds awfully superficial given the intricate complexity of the system.

#### The future

The investigation of dopamine function and the underlying networks are currently in full swing. The past several years have revealed many details that help us get a better understanding of dopamine function, and lots of mysticism has disappeared. We are not dealing with a system with clear-cut and well-parcellated functions, but we know that some of the dopamine functions are crucial for the animal's survival. What we don't know are at least two things.

How does the dopamine reward signal, as the strongest component of dopamine function, get us the best reward and thus help evolutionary fitness? An obvious approach is to study economic decision-making, which has well-developed concepts for maximizing utility. This approach assumes that decision makers identify, process, and deliberate about all available options and have clear preferences, which underlies the first Von Neumann–Morgenstern utility axiom ("completeness"). But there are many exceptions to rational decision-making, and many decisions are not based on identifiable options. We often just do what we do without actively considering the alternatives. What is the role of dopamine neurons in these processes?

As the investigation of dopamine function has revealed a number of important processes, then what are the other "neuromodulatory" systems hiding? Can we get a handle on norepinephrine after its attentional functions have been so well described<sup>84</sup>? And what about serotonin— would it have several, diverse functions<sup>85,86</sup> but ultimately a coherent denominator? And what about acetylcholine? We have tons of work to do.

Of course, all of these processes may go wrong in brain disorders, which affect more than 20% of the population and present a major human challenge. For that reason, we should invest substantial portions of our wealth into all fields of neuroscience.

#### Acknowledgments

The author is indebted to Armin Lak (University College London), Joseph F. Cheers (University of Maryland School of Medicine), Stephan Lammel (University of California, Berkeley), Donita L. Robinson (University of North Carolina), and Alexander Gomez (University of North Carolina) for helpful comments.

#### References

- Schultz W: Multiple dopamine functions at different time courses. Annu Rev Neurosci. 2007; 30: 259–88.
   PubMed Abstract | Publisher Full Text
- Corbett D, Wise RA: Intracranial self-stimulation in relation to the ascending dopaminergic systems of the midbrain: a moveable electrode mapping study. Brain Res. 1980; 185(1): 1–15.
   PubMed Abstract | Publisher Full Text
- Tsai HC, Zhang F, Adamantidis A, et al.: Phasic firing in dopaminergic neurons is sufficient for behavioral conditioning. Science. 2009; 324(5930): 1080–4.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Kim KM, Baratta MV, Yang A, et al.: Optogenetic mimicry of the transient activation of dopamine neurons by natural reward is sufficient for operant reinforcement. PLoS One. 2012; 7(4): e33612.
- Steinberg EE, Keiflin R, Boivin JR, et al.: A causal link between prediction errors, dopamine neurons and learning. Nat Neurosci. 2013; 16(7): 966–73.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Coddington LT, Dudman JT: The timing of action determines reward prediction signals in identified midbrain dopamine neurons. Nat Neurosci.

PubMed Abstract | Publisher Full Text | Free Full Text

F1000 recommended

- 2018: 21(11): 1563-73.
- PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Tan KR, Yvon C, Turiault M, et al.: GABA neurons of the VTA drive conditioned place aversion. Neuron. 2012; 73(6): 1173–83.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Chang CY, Esber GR, Marrero-Garcia Y, et al.: Brief optogenetic inhibition of dopamine neurons mimics endogenous negative reward prediction errors. Nat Neurosci. 2016; 19(1): 111-6.
  - PubMed Abstract | Publisher Full Text | Free Full Text
- Chang CY, Gardner MPH, Conroy JC, et al.: Brief, But Not Prolonged, Pauses in the Firing of Midbrain Dopamine Neurons Are Sufficient to Produce a Conditioned Inhibitor. J Neurosci. 2018; 38(41): 8822–30.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Stauffer WR, Lak A, Yang A, et al.: Dopamine Neuron-Specific Optogenetic Stimulation in Rhesus Macaques. Cell. 2016; 166(6): 1564–1571.e6.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Saunders BT, Richard JM, Margolis EB, et al.: Dopamine neurons create Pavlovian conditioned stimuli with circuit-defined motivational properties. Nat Neurosci. 2018; 21(8): 1072–83.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Athalye VR, Santos FJ, Carmena JM, et al.: Evidence for a neural law of effect. Science. 2018; 359(6379): 1024–9.
   PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Sadacca BF, Jones JL, Schoenbaum G: Midbrain dopamine neurons compute inferred and cached value prediction errors in a common framework. eLife. 2016; 5: pii: e13665.
  - PubMed Abstract | Publisher Full Text | Free Full Text
- Nakahara H, Itoh H, Kawagoe R, et al.: Dopamine neurons can represent context-dependent prediction error. Neuron. 2004; 41(2): 269–80.
   PubMed Abstract | Publisher Full Text | F1000 Recommendation
- 15. Starkweather CK, Babayan BM, Uchida N, et al.: Dopamine reward prediction errors reflect hidden-state inference across time. Nat Neurosci. 2017; 20(4): 581–9
  - PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Bermudez MA, Göbel C, Schultz W: Sensitivity to temporal reward structure in amygdala neurons. Curr Biol. 2012; 22(19): 1839–44.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Fiorillo CD, Tobler PN, Schultz W: Discrete coding of reward probability and uncertainty by dopamine neurons. Science. 2003; 299(5614): 1898–902.
   PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Lak A, Stauffer WR, Schultz W: Dopamine prediction error responses integrate subjective value from different reward dimensions. Proc Natl Acad Sci U S A. 2014; 111(6): 2343–8.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Stauffer WR, Lak A, Schultz W: Dopamine reward prediction error responses reflect marginal utility. Curr Biol. 2014; 24(21): 2491–500.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Tian J, Uchida N: Habenula Lesions Reveal that Multiple Mechanisms Underlie Dopamine Prediction Errors. Neuron. 2015; 87(6): 1304–16.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Tobler PN, Fiorillo CD, Schultz W: Adaptive coding of reward value by dopamine neurons. Science. 2005; 307(5715): 1642–5.
   PubMed Abstract | Publisher Full Text | F1000 Recommendation
- 22. F Babayan BM, Uchida N, Gershman SJ: Belief state representation in the dopamine system. Nat Commun. 2018; 9(1): 1891.
  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Bromberg-Martin ES, Matsumoto M, Hong S, et al.: A pallidus-habenula-dopamine pathway signals inferred stimulus values. J Neurophysiol. 2010; 104(2): 1068–76.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Morris G, Nevet A, Arkadir D, et al.: Midbrain dopamine neurons encode decisions for future action. Nat Neurosci. 2006; 9(8): 1057–63.
   PubMed Abstract | Publisher Full Text
- Lak A, Stauffer WR, Schultz W: Dopamine neurons learn relative chosen value from probabilistic rewards. eLife. 2016; 5: pii: e18044.
   PubMed Abstract | Publisher Full Text | Free Full Text
- 26. Lak A, Nomoto K, Keramati M, et al.: Midbrain Dopamine Neurons Signal Belief in Choice Accuracy during a Perceptual Decision. Curr Biol. 2017; 27(6): 821–32. PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Lak A, Okun M, Moss M, et al.: Neural basis of learning guided by sensory confidence and reward value. bioRxiv. 2018.
   Publisher Full Text
- Schelp SA, Pultorak KJ, Rakowski DR, et al.: A transient dopamine signal encodes subjective value and causally influences demand in an economic context. Proc Natl Acad Sci U S A. 2017; 114(52): E11303–E11312. PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- 29. F Noritake A, Ninomiya T, Isoda M: Social reward monitoring and valuation in

- the macaque brain. Nat Neurosci. 2018; 21(10): 1452–62.
  PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Baez-Mendoza R, Harris CJ, Schultz W: Activity of striatal neurons reflects social action and own reward. Proc Natl Acad Sci U S A. 2013; 110(41): 16634–9.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Báez-Mendoza R, van Coeverden CR, Schultz W: A neuronal reward inequity signal in primate striatum. J Neurophysiol. 2016; 115(1): 68–79.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Dommett E, Coizet V, Blaha CD, et al.: How visual stimuli activate dopaminergic neurons at short latency. Science. 2005; 307(5714): 1476–9.
   PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Nomoto K, Schultz W, Watanabe T, et al.: Temporally extended dopamine responses to perceptually demanding reward-predictive stimuli. J Neurosci. 2010; 30(32): 10692–702.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Fiorillo CD, Song MR, Yun SR: Multiphasic temporal dynamics in responses of midbrain dopamine neurons to appetitive and aversive stimuli. J Neurosci. 2013; 33(11): 4710–25.
   PublMed Abstract | Publisher Full Text | Free Full Text
- Schultz W: Dopamine reward prediction-error signalling: a two-component response. Nat Rev Neurosci. 2016; 17(3): 183–95.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Eshel N, Tian J, Bukwich M, et al.: Dopamine neurons share common response function for reward prediction error. Nat Neurosci. 2016; 19(3): 479–86.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Mirenowicz J, Schultz W: Preferential activation of midbrain dopamine neurons by appetitive rather than aversive stimuli. Nature. 1996; 379(6564): 449–51.
   PubMed Abstract | Publisher Full Text
- Kobayashi S, Schultz W: Reward contexts extend dopamine signals to unrewarded stimuli. Curr Biol. 2014; 24(1): 56–62.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Matsumoto H, Tian J, Uchida N, et al.: Midbrain dopamine neurons signal aversion in a reward-context-dependent manner. eLife. 2016; 5: pii: e17328. PubMed Abstract | Publisher Full Text | Free Full Text
- Kamiński J, Mamelak AN, Birch K, et al.: Novelty-Sensitive Dopaminergic Neurons in the Human Substantia Nigra Predict Success of Declarative Memory Formation. Curr Biol. 2018; 28(9): 1333–1343.e4.
   PublMed Abstract | Publisher Full Text | Free Full Text
- Ljungberg T, Apicella P, Schultz W: Responses of monkey dopamine neurons during learning of behavioral reactions. J Neurophysiol. 1992; 67(1): 145–63.
   Publed Abstract | Publisher Full Text
- 42. F Menegas W, Babayan BM, Uchida N, et al.: Opposite initialization to novel cues in dopamine signaling in ventral and posterior striatum in mice. eLife. 2017; 6: pii: e21886.

  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- 43. Takahashi YK, Batchelor HM, Liu B, et al.: Dopamine Neurons Respond to Errors in the Prediction of Sensory Features of Expected Rewards. Neuron. 2017; 95(6): 1395–1405.e3.
- PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation

  44. Menegas W, Akiti K, Amo R, et al.: Dopamine neurons projecting to the posterior
- striatum reinforce avoidance of threatening stimuli. *Nat Neurosci*. 2018; **21**(10): 1421–30.
  - PubMed Abstract | Publisher Full Text | Free Full Text
- 45. Je de Jong JW, Afjei SA, Pollak Dorocic I, et al.: A Neural Circuit Mechanism for Encoding Aversive Stimuli in the Mesolimbic Dopamine System. Neuron. 2019; 101(1): 133–151.e7.
  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Salinas-Hernández XI, Vogel P, Betz S, et al.: Dopamine neurons drive fear extinction learning by signaling the omission of expected aversive outcomes. eLife. 2018; 7: pii: e38818.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Oleson EB, Gentry RN, Chioma VC, et al.: Subsecond dopamine release in the nucleus accumbens predicts conditioned punishment and its successful avoidance. J Neurosci. 2012; 32(42): 14804–8.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Solomon RL, Corbit JD: An opponent-process theory of motivation. I. Temporal dynamics of affect. Psychol Rev. 1974; 81(2): 119–45.
   PubMed Abstract | Publisher Full Text
- Gerber B, Yarali A, Diegelmann S, et al.: Pain-relief learning in flies, rats, and man: Basic research and applied perspectives. Learn Mem. 2014; 21(4): 232–52.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Waddell S: Reinforcement signalling in Drosophila; dopamine does it all after all. Curr Opin Neurobiol. 2013; 23(3): 324–9.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Schultz W, Ruffieux A, Aebischer P: The activity of pars compacta neurons of the monkey substantia nigra in relation to motor activation. Exp Brain Res. 1983; 51(3): 377–387.
   Publisher Full Text
- Lindsay WS, Herndon JG Jr, Blakely RD, et al.: Voltammetric recording from neostriatum of behaving rhesus monkey. Brain Res. 1981; 220(2): 391–6.
   PubMed Abstract | Publisher Full Text

- Freed CR, Yamamoto BK: Regional brain dopamine metabolism: a marker for the speed, direction, and posture of moving animals. Science. 1985; 229(4708): 62–5.
  - PubMed Abstract | Publisher Full Text
- Schultz W: Responses of midbrain dopamine neurons to behavioral trigger stimuli in the monkey. J Neurophysiol. 1986; 56(5): 1439–61.
   PubMed Abstract | Publisher Full Text
- Romo R, Schultz W: Dopamine neurons of the monkey midbrain: Contingencies of responses to active touch during self-initiated arm movements. J Neurophysiol. 1990; 63(3): 592–606.
   PubMed Abstract | Publisher Full Text
- DeLong MR, Crutcher MD, Georgopoulos AP: Relations between movement and single cell discharge in the substantia nigra of the behaving monkey. J Neurosci. 1983; 3(8): 1599–606.
   PubMed Abstract | Publisher Full Text
- Schultz W, Romo R: Dopamine neurons of the monkey midbrain: contingencies of responses to stimuli eliciting immediate behavioral reactions. J Neurophysiol. 1990; 63(3): 607–24.
   PubMed Abstract | Publisher Full Text
- Hassani OK, Cromwell HC, Schultz W: Influence of Expectation of Different Rewards on Behavior-Related Neuronal Activity in the Striatum. J Neurophysiol. 2001; 85(6): 2477–89.
   PubMed Abstract | Publisher Full Text
- Roitman MF, Stuber GD, Phillips PE, et al.: Dopamine operates as a subsecond modulator of food seeking. J Neurosci. 2004; 24(6): 1265–71.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Howe MW, Tierney PL, Sandberg SG, et al.: Prolonged dopamine signalling in striatum signals proximity and value of distant rewards. Nature. 2013; 500(7464): 575-9.
   PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- 61. F Howe MW, Dombeck DA: Rapid signalling in distinct dopaminergic axons during locomotion and reward. Nature. 2016; 535(7613): 505–10.

  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- 62. F Parker NF, Cameron CM, Taliaferro JP, et al.: Reward and choice encoding in terminals of midbrain dopamine neurons depends on striatal target. Nat Neurosci. 2016; 19(6): 845–54. PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Dodson PD, Dreyer JK, Jennings KA, et al.: Representation of spontaneous movement by dopaminergic neurons is cell-type selective and disrupted in parkinsonism. Proc Natl Acad Sci U S A. 2016; 113(15): E2180–E2188.
   PubMed Abstract | Publisher Full Text | Free Full Text
- 64. Flamid AA, Pettibone JR, Mabrouk OS, et al.: Mesolimbic dopamine signals the value of work. Nat Neurosci. 2016; 19(1): 117–26.
  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- E da Silva JA, Tecuapetla F, Paixão V, et al.: Dopamine neuron activity before action initiation gates and invigorates future movements. Nature. 2018; 554(7691): 244–8
  - PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Kremer Y, Flakowski J, Rohner C, et al.: VTA dopamine neurons multiplex external with internal representations of goal-directed action. bioRxiv. 2018. Publisher Full Text
- 67. F Mohebi A, Pettibone JR, Hamid AA, et al.: Dissociable dopamine dynamics for learning and motivation. Nature. 2019; 570(7759): 65–70.
  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Engelhard B, Finkelstein J, Cox J, et al.: Specialized coding of sensory, motor and cognitive variables in VTA dopamine neurons. *Nature*. 2019; 570(7762): 509–13.
- PubMed Abstract | Publisher Full Text | F1000 Recommendation

  69. Cohen JY, Haesler S, Vong L, et al.: Neuron-type-specific signals for reward and punishment in the ventral tegmental area. Nature. 2012;

- **482**(7383): 85-8.
- PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Schultz W, Romo R: Role of primate basal ganglia and frontal cortex in the internal generation of movements. I. Preparatory activity in the anterior striatum. Exp Brain Res. 1992; 91(3): 363–84.
   PubMed Abstract | Publisher Full Text
- Lammel S, Hetzel A, Häckel O, et al.: Unique Properties of Mesoprefrontal Neurons within a Dual Mesocorticolimbic Dopamine System. Neuron. 2008; 57(5): 760–73.
  - PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Beier KT, Steinberg EE, DeLoach KE, et al.: Circuit Architecture of VTA Dopamine Neurons Revealed by Systematic Input-Output Mapping. Cell. 2015; 162(3): 622–34.
  - PubMed Abstract | Publisher Full Text | Free Full Text
- Morales M, Margolis EB: Ventral tegmental area: cellular heterogeneity, connectivity and behaviour. Nat Rev Neurosci. 2017; 18(2): 73–85.
   PubMed Abstract | Publisher Full Text
- Glowinski J, Chéramy A, Romo R, et al.: Presynaptic regulation of dopaminergic transmission in the striatum. Cell Mol Neurobiol. 1988; 8(1): 7–17.
   PubMed Abstract | Publisher Full Text
- 75. Threlfell S, Lalic T, Platt NJ, et al.: Striatal dopamine release is triggered by synchronized activity in cholinergic interneurons. Neuron. 2012; 75(1): 58–64. PubMed Abstract | Publisher Full Text | F1000 Recommendation
- Enomoto K, Matsumoto N, Nakai S, et al.: Dopamine neurons learn to encode the long-term value of multiple future rewards. Proc Natl Acad Sci U S A. 2011; 108(37): 15462–7.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Berke JD: What does dopamine mean? Nat Neurosci. 2018; 21(6): 787–93.
   PubMed Abstract | Publisher Full Text | Free Full Text
- Lee RS, Mattar MG, Parker NF, et al.: Reward prediction error does not explain movement selectivity in DMS-projecting dopamine neurons. eLife. 2019; 8: pii: e42992.
  - PubMed Abstract | Publisher Full Text | Free Full Text
- Gershman SJ: Dopamine ramps are a consequence of reward prediction errors. Neural Comput. 2014; 26(3): 467–71.
   PubMed Abstract | Publisher Full Text
- Kim HR, Uchida N: A derivative-like computations underlie dopamine prediction error coding based on dynamic sensory stimuli. Soc Neurosci Abstract. 2018; 109: 9.
- 81. Lloyd K, Dayan P: Tamping Ramping: Algorithmic, Implementational, and Computational Explanations of Phasic Dopamine Signals in the Accumbens. PLoS Comput Biol. 2015; 11(12): e1004622.

  PubMed Abstract | Publisher Full Text | Free Full Text
- Schultz W, Apicella P, Ljungberg T: Responses of monkey dopamine neurons to reward and conditioned stimuli during successive steps of learning a delayed response task. J Neurosci. 1993; 13(3): 900–13.
   PubMed Abstract | Publisher Full Text
- Schultz W, Apicella P, Ljungberg T, et al.: Reward-related activity in the monkey striatum and substantia nigra. Prog Brain Res. 1993; 99: 227–35.
   PubMed Abstract | Publisher Full Text
- 84. Vazey EM, Moorman DE, Aston-Jones G: Phasic locus coeruleus activity regulates cortical encoding of salience information. Proc Natl Acad Sci U S A. 2018; 115(40): E9439–E9448.
  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- 85. F Cohen JY, Amoroso MW, Uchida N: Serotonergic neurons signal reward and punishment on multiple timescales. eLife. 2015; 4: e06346.
  PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation
- Miyazaki K, Miyazaki KW, Yamanaka A, et al.: Reward probability and timing uncertainty alter the effect of dorsal raphe serotonin neurons on patience. Nat Commun. 2018; 9(1): 2048.
  - PubMed Abstract | Publisher Full Text | Free Full Text | F1000 Recommendation

### **Open Peer Review**

| <b>Current Peer Review Status:</b> | • | • |  |  |
|------------------------------------|---|---|--|--|
|                                    |   |   |  |  |

### **Editorial Note on the Review Process**

F1000 Faculty Reviews are written by members of the prestigious F1000 Faculty. They are commissioned and are peer reviewed before publication to ensure that the final, published version is comprehensive and accessible. The reviewers who approved the final version are listed with their names and affiliations.

### The reviewers who approved this article are:

### Version 1

1 Stephan Lammel

Department of Molecular and Cell Biology and Helen Wills Neuroscience Institute, University of California, Berkeley, CA 94720, USA

Competing Interests: No competing interests were disclosed.

2 Joseph F. Cheer

Department of Anatomy and Neurobiology and Department of Psychiatry, University of Maryland School of Medicine, Baltimore, MD, USA

Competing Interests: No competing interests were disclosed.

3 Donita L. Robinson

Bowles Center for Alcohol Studies and Department of Psychiatry, University of North Carolina, Chapel Hill, NC, USA

Alexander Gómez-A

Department of Psychiatry, University of North Carolina, Chapel Hill, NC, USA

Competing Interests: No competing interests were disclosed.