Supplement for "Reinforcement learning links spontaneous dopamine impulses to a reward"

Supplemental Figure Legends

Figure S1. Comparison of signals from genetically expressed $GRAB_{DA}$ and implanted D2-CNiFER cells.

A. Schematic of design of the genetically expressed dopamine sensor, GRAB_{DA}, compared to D2-CNiFERs. GRAB_{DA} is constructed by inserting the dopamine binding site on the D2-GPCR into cpGFP. Binding of DA causes conformational changes in the binding site that effect the efficiency of fluorescence.

- **B.** Averaged image showing region of GRAB_{DA} expression and a D2-CNiFER implant. GRAB_{DA} expression was induced using a viral vector.
- **C.** Simultaneous measurement of genetically expressed $GRAB_{DA}$ (blue, top) and implanted D2-CNiFER cells (green, middle). A small region of interest near the center of the region of $GRAB_{DA}$ expression was averaged and a fluorescence trace was calculated. The $GRAB_{DA}$ signal had significant drift in baseline on the scale of tens of minutes, but had better signal-to-noise and temporal resolution than the D2-CNiFER signal.
- **D.** Comparison of normalized detrended $GRAB_{DA}$ signal and normalized D2-CNiFER signal. The $GRAB_{DA}$ signal did not exhibit the decay tail that the D2-CNiFER signal had, and was about twice as bright; small transients that were detected by $GRAB_{DA}$ were not always detected by the D2-CNiFERs. Transients occurring in quick succession as observed by $GRAB_{DA}$ appeared as a single, longer transient when observed by D2-CNiFERs.

E. Normalized average transient triggered response of GRAB_{DA} (blue) and D2-CNiFER (green) signals. The GRAB_{DA} signal both rose and decayed more rapidly than the D2-CNiFER signal, as one would expect; the change in fluorescence in the D2-CNiFER signal requires activation of a second messenger pathway that is not necessary in GRAB_{DA}.

Figure S2. Additional analysis of dopamine levels.

A. Extraction of basal DA from the measured [DA]_{ex}. A LOESS fit (tricubic weighting function, linear fit) was applied to the measured signal (blue) to extract DA transients. The window size was 940 s and the step size was 11 s. The transients were subtracted from the total DA signal to get the basal DA (black).

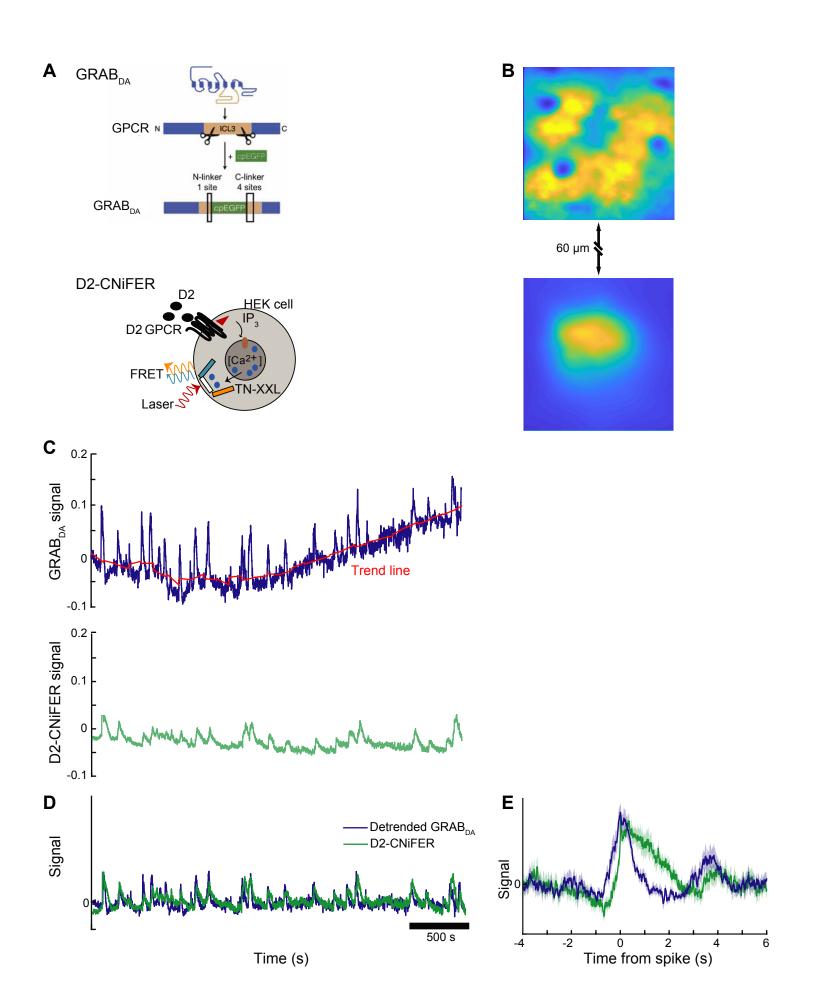
- **B.** Leaky integration of the phasic DA signal does not reproduce the ramping basal DA signal. The phasic DA signal (blue), was extracted from the measured [DA]_{ex} using a LOESS fit. A leaky integrator, with exponential decay time τ , was applied to this signal (yellow, green) for values of τ = 100 s, 200 s, 500 s, and 1000 s. The leaky integrator fails to reproduce the shift in basal DA that we observe. Although the integrator with a half-decay time of 500 s shows a similar shift upwards in the DA response, it ramps up to this level much quicker, i.e., around 100 s, than the 1000 s that we observe (black line).
- **C.** Two-dimensional histograms showing the change in dopamine transient properties over training. Transient amplitudes during Day 3 of feedback training were significantly larger than those in the naïve animal. Transient widths during both Days 2 and 3 of feedback training were significantly longer than those in the naïve animal. Transient properties when feedback was turned off on Day 4 did not significantly differ from the naïve animal. The average widths of transients were 15.1 ± 1.3 s, 25.4 ± 2.1 s, 43.1 ± 2.5 s, and 18.5 ± 1.7 s; the corresponding average amplitudes were 0.056 ± 0.002 , 0.045 ± 0.003 , 0.081 ± 0.004 , and 0.056 ± 0.002 for Days 1, 2, 3, and 4, respectively.
- **D.** Two-dimensional histograms showing dopamine transient properties when animals were randomly rewarded. Transient width was significantly shorter on Days 3 and 4 compared to Days 1 and 2. Transient amplitudes were lower when animals rewarded compared to when they were not. The average widths of transients were $22.4 \pm 2.1 \text{ s}$, $24.6 \pm 2.3 \text{ s}$, $13.1 \pm 1.3 \text{ s}$, and $14.7 \pm 1.6 \text{ s}$; the corresponding average amplitudes were 0.052 ± 0.003 , 0.029 ± 0.002 , 0.027 ± 0.0005 , and 0.039 ± 0.002 for Days 1, 2, 3, and 4 respectively.

Figure S3. Introduction of a dry lick port introduces a small correlation between running and dopamine release.

- **A.** Average spectral coherence between running and phasic dopamine release across animals (9 mice with lick port, 7 mice without lick port). In the presence of a lick port, coherence was significant at frequencies below 0.2 Hz. In the absence of a lick port, coherence was not significant. The coherence was calculated using the multi-taper method; the bandwidth was 0.02 Hz from averaging with 143 tapers.
- **B.** Histograms of the predictions of a linear model of $[DA]_{ex}$ as a function of running speed versus the measured $[DA]_{ex}$ in the absence of a lick port during four consecutive days of experiments. White line shows the expected distribution of a perfectly predictive model. The model was fit to the data in the frequency domain, making use of the convolution theorem.

Cross-spectral power was calculated with a multitaper estimate. A new model was fit for each trial; each histogram uses data from all trials within a given day of the experiment.

- **C.** Same as panel B, but in the presence of a lick port. Animals were trained to increase [DA]_{ex} for these data.
- **D.** Variance explained by linear model of [DA]_{ex} as a function of running speed in the absence of a lick port for different days of the experiment. This was calculated directly from the data shown in panel B. Each trial was a separate data point. R^2 was 0.011 \pm 0.005, 0.009 \pm 0.002, 0.010 \pm 0.005, and 0.009 \pm 0.003 for Days 1, 2, 3, and 4 respectively.
- **E.** Same as panel D, but in the presence of a lick port. R^2 was 0.1 \pm 0.1, 0.08 \pm 0.1, 0.2 \pm 0.2, and 0.04 \pm 0.07 for naïve, Day 2 of training, Day 3 of training, and feedback OFF days respectively.



Supplemental Figure 1. Foo, Lozada, Aljadeff, LI, Wang, Slesinger & Kleinfeld

