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Distinct temporal structure of nicotinic ACh receptor activation determines responses of VTA neurons to endogenous ACh and nicotine

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1 **Distinct temporal structure of nicotinic ACh receptor activation determines responses of**
2 **VTA neurons to endogenous ACh and nicotine**

3 Abbreviated Title: **VTA responses to endogenous ACh and nicotine**

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27

28 **Distinct temporal structure of nicotinic ACh receptor activation determines responses of**
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31 **Abstract**

32 The addictive component of tobacco, nicotine, acts through nicotinic acetylcholine receptors
33 (nAChRs). The $\beta 2$ subunit-containing nAChRs ($\beta 2$ -nAChRs) play a crucial role in the rewarding
34 properties of nicotine and are particularly densely expressed in the mesolimbic dopamine (DA)
35 system. Specifically, nAChRs directly and indirectly affect DA neurons in the ventral tegmental
36 area (VTA). Understanding of ACh and nicotinic regulation of DA neuron activity is incomplete.
37 By computational modeling, we provide mechanisms for several apparently contradictory
38 experimental results. First, systemic knock out of $\beta 2$ -containing nAChRs drastically reduces DA
39 neurons bursting even though the major glutamatergic (Glu) afferents that have been shown to
40 evoke this bursting stay intact. Second, the most intuitive way to rescue this bursting - by re-
41 expressing the nAChRs on VTA DA neurons - fails. Third, nAChR re-expression on VTA
42 GABA neurons rescues bursting in DA neurons and increases their firing rate under the influence
43 of ACh input, whereas nicotinic application results in the opposite changes in firing. Our model
44 shows that, first, without ACh receptors Glu excitation of VTA DA and GABA neurons remain
45 balanced and cancel each other. Second, re-expression of ACh receptors on DA neurons provides
46 an input that impedes membrane repolarization and is ineffective in restoring firing of DA
47 neurons. Third, the distinct responses to ACh and nicotine are due to distinct temporal patterns of
48 these inputs: pulsatile vs. continuous. Altogether this study highlights how $\beta 2$ -nAChRs influence
49 co-activation of VTA DA and GABA neurons required for motivation and saliency signals
50 carried by DA neuron activity.

51 **Significance statement**

52 Tobacco use remains the worldwide leading cause of preventable mortality. Nicotine, the
53 addictive component of tobacco, exerts its effects through nicotinic acetylcholine receptors
54 (nAChRs). The central dopamine (DA) system, and particularly DA release by neurons
55 contained in ventral tegmental area (VTA) is shown to play a central role in developing
56 addictions. Understanding of ACh and nicotinic regulation of DA neuron activity is incomplete,
57 and here we resolve several apparently contradictory experimental results. In particular, we show
58 that distinct responses to ACh and nicotine observed in certain experiments are due to distinct
59 temporal patterns of these inputs: pulsatile vs. continuous. This distinction highlights how
60 motivation and saliency signals carried by DA signaling are hijacked by nicotine and other
61 addictive drugs.

62 **Introduction**

63 As more than five million smokers die every year from the consequences of tobacco use, it
64 remains the worldwide leading cause of preventable mortality (CDCTobaccoFree, 2017).
65 Underlying neurobiological mechanisms of tobacco dependence have been extensively explored
66 (Taly et al., 2009; Changeux, 2010; Benowitz, 2010, 2009), but remain far from being
67 understood at the neural circuit level. Nicotine, the addictive component of tobacco (Marti et al.,
68 2011), acts through nicotinic acetylcholine receptors (nAChRs) (Role and Kandel, 2008). Among
69 the different nAChRs, the β 2-containing nAChRs (β 2-nAChRs) play a crucial role in positive
70 rewarding properties of nicotine (Picciotto et al., 1998; Durand-de Cuttoli et al., 2018) and is
71 particularly densely expressed in the mesolimbic reward system (Klink et al., 2001).
72 The mesolimbic reward system and, specifically, reward-related dopamine (DA) release
73 throughout the brain plays a major role in addictive and drug-seeking behaviors (Koob et al.,
74 1998; Everitt and Robbins, 2005; Keiflin and Janak, 2015). DA-releasing neurons have two
75 major modes of activity: nearly-tonic background firing and bursting. Background firing is
76 responsible for the basal DA levels in the projection areas and is altered in psychiatric disorders
77 from depression to schizophrenia (Grace, 1991; Nestler and Carlezon, 2006). Phasic DA
78 changes, caused by DA neuron burst firing follow external stimuli and are suggested to serve as
79 motivational, saliency and unexpected reward signals (Schultz, 2002; Redgrave and Gurney,
80 2006). Bursting mode of the DA neuron is associated with an increase in occurrence of the
81 behavior that preceded the burst by the mechanism called reinforcement learning (Bayer and
82 Glimcher, 2005; Keiflin and Janak, 2015). DA neurons are contained in the VTA together with
83 γ -aminobutyric acid (GABA) neurons. Most drugs of abuse alter DA levels either directly through
84 receptor binding (Lüscher and Ungless, 2006), or indirectly by acting on VTA GABA neurons

85 (Steffensen et al., 2011; Bocklisch et al., 2013). Nicotine influence is very complex to analyze
86 since it enhances DA release by acting on multiple targets on both VTA DA and GABA neurons
87 (Tolu et al., 2013; Faure et al., 2014). Mechanisms of nicotinic influence proposed in previous
88 studies (Mansvelder et al., 2002; Mao et al., 2011) could not explain why, for example, repeated
89 nicotine injections cause excitation of the GABA neurons and yet increase DA release.
90 Therefore, there is a gap in understanding the complex interaction of VTA DA and GABA
91 neurons, which we address through data-based computational modeling.

92 β 2-nAChRs are expressed on both VTA DA and GABA neurons. Systemic deletion of the
93 receptors eliminates bursting mode of DA neurons (Mameli-Engvall et al., 2006) (Fig. 1A). Such
94 DA neuron bursting is in turn implicated in reinforcement (Bayer and Glimcher, 2005; Keiflin
95 and Janak, 2015). The role of β 2-nAChRs on DA or GABA neurons in nicotine reinforcement
96 (i.e. an increase in nicotine consumption) was addressed in previous papers using re-expression
97 of the β 2-nAChRs in specific cell populations of the VTA. It has been shown that a global re-
98 expression of the β 2-nAChRs in all the VTA (Mameli-Engvall et al., 2006; Naudé et al., 2016)
99 augmented DA neuron firing rate and burstiness compared to β 2 KO mice (Fig 1B – C purple vs.
100 red). Activation of β 2-nAChRs by ACh specifically on the VTA GABA neurons results in
101 increased firing and, importantly, augmented burstiness of DA neurons (Fig. 1D, blue vs. red).
102 By contrast, activation of these receptors expressed only on DA neurons by ACh does not
103 produce this effect (Fig. 1D, green).

104 Adding to the complexity, exposing β 2-nAChRs to nicotine produces different effects (data
105 summarized in Fig. 2): In the case of receptors re-expression on the GABA neurons, nicotine
106 increases GABA neuron firing rates and, consecutively, decreases the DA neuron firing rate and
107 bursting (Fig. 2 blue), in contrast to baseline conditions with endogenous ACh input. Nicotine

108 acting through nAChRs expressed only on DA neurons significantly increases DA neuron firing
109 rate, but not bursting (Fig. 2 green, (Tolu et al., 2013)). Finally, if the receptors are expressed on
110 all VTA neurons (Mameli-Engvall et al., 2006; Tolu et al., 2013; Naudé et al., 2016), nicotine
111 robustly increased firing rate and bursting of DA neurons (Fig. 2 purple, (Naudé et al., 2016)).
112 Attempts to explain this bidirectional modulation heuristically, for example by receptor
113 desensitization, have not been successful. We turn to computational modelling to clarify this
114 apparent conundrum. In this paper, we analyze the role of local interactions between DA and
115 GABA neurons that mediate the influence of $\beta 2$ -nAChR on the key properties of the DA neuron
116 activity.

117 By computational modeling, we (1) reconcile the increase of VTA DA cell activity under
118 endogenous ACh with its nicotine-evoked suppression when $\beta 2$ -nAChRs are re-expressed only
119 on the VTA GABA neurons; (2) show why receptor re-expressions restricted to the DA or
120 GABA neurons do not restore nicotine impact on the DA firing to levels seen in wild type (WT)
121 animals, while re-expression in all VTA neurons does.

122

123 **Methods**

124 **VTA network:**

125 The model network consists of a DA neuron innervated by a population of GABA neurons (Fig.
126 3A). The DA neuron received Glu excitatory input, and both DA and GABA neurons receive
127 cholinergic input via nACh receptors. There are other inputs to this circuit, for example from the
128 nucleus accumbens, but experiments show that re-expression only in the VTA (on all VTA cells)
129 restores all the differences observed in $\beta 2$ -/- knockout (Naudé et al., 2016). Therefore, these
130 afferents are unlikely to be responsible for the observed differences. Thus, other inputs are

131 omitted in the model. The biophysical models of the DA and GABA neurons are conductance-
 132 based one-compartmental models modified from (Morozova et al., 2016a) by adding nAChR
 133 currents:

$$c_m \frac{dv_{DA}}{dt} = I_{Ca} + I_{KCa} + I_K + I_{DR} + I_{Na} + I_{sNa} + I_{leak} + I_h + I_{NMDA} + I_{AMPA} + I_{GABA} + I_{AChDA}$$

$$c_m \frac{dv_{GABA}}{dt} = I_K + I_{Na} + I_{leak} + I_{AChGABA}$$

134 For complete description of the model, see Morozova et al. (2016). Briefly, The first eight
 135 currents in the DA neuron equation are intrinsic: calcium, calcium-dependent potassium (SK),
 136 subthreshold potassium, spike-producing potassium delayed rectifier and sodium, subthreshold
 137 sodium, leak and hyperpolarization-activated cationic current (H). The rest of the currents are
 138 synaptic: NMDA, AMPA, GABA_A and nACh receptors. The GABA neuron includes only spike-
 139 producing sodium and potassium, and the leak intrinsic currents, and the nACh receptor current.
 140 Gating variables for all currents are modeled in the standard form $\frac{dX}{dt} = \frac{X_{inf}(V) - X}{\tau_X}$, where X
 141 denotes a specific gating variable, $X_{inf}(V)$ is the function of its steady state activation, and τ_X is
 142 its time constant. The model has been calibrated using in vitro and in vivo data in the previous
 143 publications (see (Morozova et al., 2016a, 2016b)). We list the values for all parameters in
 144 extended data Table 1-1 and refer the reader to the above publications for detailed explanations.

145

146 **Cholinergic currents:**

147 We modeled only the nAChR currents on VTA neurons because other currents affected by
 148 cholinergic inputs are not changed in the KO conditions, and, thus, cannot cause the observed
 149 differences. The nAChR currents on DA and GABA neurons are given by the following
 150 expressions respectively: $I_{AChDA} = g_{AChDA}(E_{ACh} - v_{DA})$ and $I_{AChGABA} = g_{AChGABA}(E_{ACh} - v_{GABA})$.

151 Here, $E_{ACh} = 0$. The model of nAChR activation and desensitization was adapted from
 152 (Graupner et al., 2013). Note that the approach has been also validated and used to partially
 153 explain data in (Tolu et al., 2013). The model for the nAChR-mediated currents has four
 154 different states of the nAChR: deactivated/sensitized (also resting or responsive state),
 155 activated/sensitized, activated/desensitized and deactivated/desensitized state (Graupner et al.,
 156 2013). The mean total activation level of nAChRs is a product of the fraction of receptors in the
 157 activated state Ach_{act} and the fraction of receptors in the sensitized state $(1 - Ach_{des})$, thus,
 158 conductance of the cholinergic current is given by $g_{ACh} = \bar{g}_{ACh} \cdot Ach_{act} \cdot (1 - Ach_{des})$. The time
 159 course of the activation and desensitization variables is given by $\frac{dAch_{act}}{dt} = \frac{Ach_{act\infty} - Ach_{act}}{\tau_{Ach_{act}}}$

160 and $\frac{dAch_{des}}{dt} = \frac{Ach_{des\infty} - Ach_{des}}{\tau_{Ach_{des}}}$ respectively. $\tau_{Ach_{act}} = 5ms$ is an activation time constant,

161 $\tau_{Ach_{des}} = 500 + 6 \cdot 10^5 \cdot \frac{1}{1 + (\frac{inp_{Nic}}{K_\tau})^3}$ ms is a nicotine concentration-dependent desensitization time

162 constant. Steady states $Ach_{act\infty}$ and $Ach_{des\infty}$ are given by Hills equations of the form

163 $Ach_{act} = \frac{1}{(1 + (\frac{EC_{50}}{inp_{ACh} + w \cdot inp_{Nic}})^{1.05})}$ and $Ach_{des} = \frac{1}{(1 + (\frac{IC_{50}}{inp_{Nic}})^{0.5})}$. Here, EC_{50} and IC_{50} are the

164 half-maximal concentrations of nAChR activation and desensitization respectively. w is the
 165 potency of nicotine to evoke a response. The parameters for the cholinergic currents were
 166 calibrated in previous publications (Graupner et al., 2013; Tolu et al., 2013). We refer the reader
 167 to these publications for detailed explanations and list the values in Extended data Table 1-1,
 168 except for the parameters recalibrated in this study listed in Tables 1 and 2.

169

170 Nicotine has relatively slow pharmacodynamics in the brain, hence the application of nicotine
171 was modeled as slow increase in inp_{nic} causing slow activation of the nAChRs followed by yet
172 slower desensitization. On the other hand, endogenous cholinergic input to the VTA was
173 temporally structured as a spike train with a bimodal distribution to achieve bursty firing pattern.
174 The majority of neurons in laterodorsal tegmental nucleus (LTDg) and pedunculopontine
175 tegmental nucleus (PPTg) are generally slow, maintaining individual firing rates averages
176 between 2 and 5 Hz (Sakai, 2012; Kayama et al., 1992). Putative cholinergic neurons transiently
177 increase their firing rate reaching 10 Hz in response to sensory stimuli (Koyama et al., 1994). It
178 has been shown that LTDg neurons are essential for DA neuron burst firing. However,
179 microiontophoretically applied acetylcholine onto identified DA neurons, while inactivating the
180 LDTg, failed to induce burst firing in DA neurons (Lodge and Grace, 2006). This likely suggests
181 that temporal structure of cholinergic input onto VTA neurons is crucial for DA neuron burst
182 firing. The number of these afferent neurons converging to each VTA neuron is not known. We
183 assume this number to be in the range of 20-60 suggested for other subcortical afferents.
184 Multiplying the number of afferent neurons by the rate, under the assumption that the projecting
185 neurons are asynchronous, gives us the average ACh afferent input frequencies of 60-180 Hz. If
186 ACh afferents are synchronized, these rates will be lower, whereas the amplitude of this input
187 will be greater. Thus, we position the peaks of the frequency distributions for ACh input at 3.3
188 and 30 Hz (i.e. interspike intervals of 300 and 30 ms). The ACh input spiketrain was generated
189 by drawing the interspike intervals from the two normal distributions with standard deviation
190 7Hz and their relative contributions of 0.7 and 0.3 for 30 and 3.3 Hz respectively (Fig. 3B).

191 Assuming that the intravenous nicotine concentration slowly builds up at the site of the receptor,
 192 it increases and then decays exponentially in the model with a rise time constant of 0.5 min and
 193 decay time constant of 3 min (Fig. 3C):

$$inp_{Nic} = Ainp_{Nic} \left(e^{-\frac{t}{\tau_{rise}}} - e^{-\frac{t}{\tau_{decay}}} \right)$$

194 The amplitude of the nicotinic input $Ainp_{nic}$ is assumed to be lower by a factor of 10 than that of
 195 ACh (Table 1) because, by contrast to nicotine, ACh is released locally at the synapse. The
 196 concentrations match those projected from experiments (Garzón et al., 1999). The model is
 197 coded in MATLAB/c++, and the code is available on ModeDB database.

198 Table 1: Model parameters (see Extended data Table 1-1 for full list)

Parameter	Description	DA neuron	GABA neuron
$Ainp_{ACh}$	Amplitude of ACh input	5 uM	10 uM
$Ainp_{Nic}$	Amplitude of Nic input	0.5 uM	0.5 uM
w	Potency of Nic to evoke response	3	3
g_{GABA}	GABAR conductance	2.5 mS/cm ²	-
g_{NMDA}	NMDAR conductance	4 mS/cm ²	0 mS/cm ²
g_l	Leak conductance	0.03 mS/cm ²	0.05+0.05(rnd-0.5) mS/cm ²

199

200 Table 2: ACh receptor maximal conductance used to reproduce different KO-re-expression cases

Parameter	KO	Re-expression on DA	Re-expression on GABA	Re-expression on both, WT case

\bar{g}_{AChDA}	0	5 mS/cm^2	0	10 mS/cm^2
$\bar{g}_{AChGABA}$	0	0	4 mS/cm^2	1.5 mS/cm^2

201

202 **DA neuron firing pattern quantification**

203 According to the classical definition (Grace and Bunney, 1984), bursts were identified as discrete
 204 events consisting of a sequence of spikes with burst onset defined by two consecutive spikes
 205 within an interval less than 80 msec, and burst termination defined by an interspike interval
 206 greater than 160 msec. To quantify bursting we used the % of spikes within burst (%SWB),
 207 calculated as the number of spikes within bursts divided by the total number of spikes. In our
 208 simulations, the majority of bursts were composed of doublets; this is consistent with data (Grace
 209 and Bunney, 1984; Mameli-Engvall et al., 2006; Exley et al., 2011). In experiments (Mameli-
 210 Engvall et al., 2006), the mean number of spikes in WT mice in a burst was 3.1 ± 0.52 . In our
 211 simulations, the average length was 2.7 ± 0.25 spike per burst, which is within the range observed
 212 in the experiments.

213 **Results**

214 With our model, we give an account *in silico* for the ACh- and nicotine-induced modulations
215 observed in the experiments. We explain and provide mechanisms for several apparently
216 contradictory experimental results. First, systemic KO of β 2-containing nAChRs drastically
217 reduces DA neuron bursting even though the major Glu afferents that have been shown to evoke
218 this bursting stay intact. Second, the most intuitive way to rescue this bursting by reexpressing
219 the nAChRs on VTA DA neurons fails. Third, nAChR re-expression on VTA GABA neurons
220 rescues DA neuron bursting under the influence of ACh input, but nicotinic application results in
221 the opposite changes in VTA DA neuron firing.

222

223 **Balanced excitatory and inhibitory inputs to DA neurons support their tonic firing in the**
224 **β 2 nAChR knock-out conditions**

225 In animals lacking β 2-containing nAChRs, VTA DA neurons were shown to fire at lower
226 frequencies than the controls, and display practically no bursting *in vivo* (see Figs 1,2). Burst
227 firing of VTA DA neurons has been previously, at least in part, attributed to activation of their
228 Glu synaptic inputs (Morikawa et al., 2003; Blythe et al., 2007; Deister et al., 2009). This leads
229 to a question why the knockout of β 2 containing nAChRs abolished bursting in DA neurons if
230 their Glu inputs remain intact? Considering that some excitatory inputs to the VTA DA neurons
231 are tonically active (e.g. STN (Wilson et al., 2004)), we modeled the Glu inputs as Poisson-
232 distributed spike trains, which together produce near-tonic activation of NMDA receptors on DA
233 neurons. Simultaneously, the DA neurons receive inhibitory inputs (Paladini and Tepper, 1999;
234 Kauffling et al., 2010), which in the model are provided by population activity of VTA GABA
235 neurons. While Glu inputs alone through NMDA receptor activation can cause increases in DA

236 neuron firing and bursting, co-activation of GABA receptors can balance the excitation and re-
237 establish low-frequency near-tonic firing (Lobb et al., 2010). This behavior have been
238 reproduced in previous modeling studies (Morozova et al., 2016a). Accounting for the low-rate
239 tonic firing activity of the DA neuron required the GABAR and NMDAR conductances in the
240 model to be set to produce a balance in the GABA and Glu inputs to the DA neuron (Fig. 4).
241 Thus, the model implies that in the $\beta 2$ nAChR KO conditions the excitatory and inhibitory inputs
242 to VTA DA neurons remain balanced and preserve tonic activity of the neurons.

243

244 **Intrinsic excitability properties of the DA neuron limit effects of direct excitation via $\beta 2$ -**
245 **containing nAChRs**

246 The most intuitive explanation of low DA neurons' bursting in $\beta 2$ nAChR KO mice would be the
247 lack of direct excitation through these receptors on DA neurons. However, targeted re-expression
248 of the receptors on DA neurons does not alleviate low bursting (Fig. 1 green). The firing rate also
249 remains much lower than in the WT conditions. The main effect of this re-expression is that
250 nicotine application produces robust increase in the firing rate of DA neurons (Fig. 2 green),
251 similar to that in WT conditions. However, bursting is not increased during the influence of
252 nicotine (Fig. 2 green), by contrast to that in the WT mice.

253 Conductance of the nAChR current was set to a low value ($\bar{g}_{AChDA} = 5mS/cm^2$) to reproduce the
254 lack of significant change in the firing rate of the $\beta 2$ DA-VEC (experiment: Fig. 1 green; model:
255 Fig. 5 green) in comparison with the KO case (Experiment: Fig. 1 red; model: Fig. 5 red). For
256 these low conductance values, bursting was also not altered by the direct ACh inputs on the DA
257 neurons. The choice of the conductance value was based on our parametric analysis of its
258 influence on the DA neuron firing rate and bursting included in Extended data (Fig. 5-1). Thus,

259 the model reproduces experimentally observed invariance of the VTA DA cell activity under the
260 direct nAChR-mediated cholinergic input to the DA neurons.

261 In addition to the cholinergic input, we were able to account for the effects of the nicotine
262 application. As in the experiments, the firing rate, but not bursting of the DA neuron
263 substantially increases with activation of the $\beta 2$ receptors for about 300 sec by elevated nicotine
264 concentration (Fig. 6 green). The increase is significant, by contrast to that produced by ACh
265 alone. This simply reflects a greater increase in the nAChR-mediated current by the combination
266 of nicotine and ACh. Desensitization of the receptors will eventually decrease their current, but
267 at a much longer timescale of 1 min.

268 The explanation for the lack of increase in burstiness during nicotine exposure is that bursting in
269 DA neurons strongly relies on the activation of the NMDA receptor (Overton and Clark, 1992;
270 Chergui et al., 1993; Deister et al., 2009) due to its voltage dependence (magnesium block)
271 (Deister et al., 2009; Ha and Kuznetsov, 2013). By contrast, tonic activation of linear current
272 mediated by the nicotinic receptors is not effective in eliciting bursting in DA neurons. In fact we
273 can think about the nAChR-mediated current as being similar to a slow-varying AMPA input,
274 since both are not-voltage dependent, as opposed to the voltage-rectifying NMDA-synaptic
275 currents. Therefore, even strong continuous increase in the nAChR-mediated current on the VTA
276 DA neuron does not increase its bursting.

277

278 **Distinct temporal profiles of AChR activation explains opposite effects of endogenous ACh**
279 **and nicotine on VTA DA neuron firing.**

280 Counter-intuitively when $\beta 2$ -containing nAChRs are re-expressed only on VTA GABA neurons,
281 endogenous ACh input and exogenous nicotinic application results in opposite changes in firing

282 of VTA DA neurons. In particular, the firing rate and especially bursting of VTA DA neurons
283 are sharply increased after the re-expression of $\beta 2$ nAChRs on VTA GABA neurons compared to
284 the KO conditions (experiment: Fig. 1; model: Fig. 5 blue vs. red). By contrast, additional
285 agonist effect on these receptors by nicotine causes a decrease in the firing and bursting of the
286 DA neuron (experiment: Fig. 2 blue; model: Fig. 6 blue). While the decrease in the firing caused
287 by nicotine can be intuitively explained by a greater activation of the GABA neurons, which in
288 turn inhibits the DA neurons, the boost in activity of DA neurons produced by ACh is harder to
289 understand. We show that our model is capable to account for these effects in a mechanistic
290 manner.

291 As before, cholinergic input arriving at the GABA neurons was modeled by a spike train
292 reproducing burstiness of the afferents (see Methods). Following afferent convergence principle,
293 we assumed that a subpopulation of VTA GABA neurons receives common endogenous
294 cholinergic input that activates the $\beta 2$ nAChRs on these neurons. Previously, we have shown that
295 such common input can synchronize the GABA neurons and functionally invert their inhibitory
296 influence on DA neurons (Morozova et al., 2016a). We showed that a synchronous pulsatile
297 GABA input is able to significantly increase firing rate and burstiness of the DA neurons via
298 dynamical reduction the Ca^{2+} -dependent K^+ current. This mechanism works here for the
299 influence of ACh inputs through the GABA neurons onto the DA neurons: due to fast, transient
300 activation of nAChRs, cholinergic pulses act as synchronizing inputs to GABA neurons (Fig. 7).
301 The synchronized GABA synaptic input onto the DA neuron acts in turn to increase its firing rate
302 and burstiness. Thus, experimentally observed increases in firing and bursting of the DA neurons
303 that follow nAChRs re-expression on VTA GABA neurons could be mechanistically explained

304 by changing the level of synchronization in the population of the GABA neurons (Morozova et
305 al., 2016a).

306 By contrast to the pulsatile activation of nAChRs by ACh afferents, nicotine activates nAChR on
307 GABA neurons tonically and then desensitizes them. This produces an increase in GABA neuron
308 firing rate without synchronizing the neurons (data not shown). This in turn leads to an increase
309 in the tonic component of GABA synaptic activation on DA neurons. Tonic GABA activation on
310 DA neurons leads to a decrease in their firing, which allows us to reproduce the inhibitory
311 influence of nicotine through GABA neurons (Fig. 6 blue; see Fig. 6-1 for parameter
312 dependence).

313

314 **Co-activation of $\beta 2$ nAChRs on VTA DA and GABA neurons is required for both ACh and**
315 **nicotine to boost DA neuron bursting**

316 Under the ACh input, re-expression of $\beta 2$ -containing nAChRs on all VTA neurons elevated
317 firing rate and burstiness of DA neurons to the levels displayed in the WT animals (see Fig 1B).
318 We have reproduced this modulation in the model (Fig. 5 purple). However, this required a
319 modification of the nAChR conductances compared to the above re-expression cases (Table 2).
320 The model shows that the ACh- and nicotine-induced modulations strongly depend on the
321 balance between expression of these receptors on DA and GABA neurons. For example, if we
322 combine the conductances at the values used in the two single re-expression cases, both firing
323 rate and bursting will be very high under the ACh input, but decrease with nicotinic application,
324 which is opposite to experiments. Therefore, nAChR conductance was reduced by a factor of 2.6
325 on the GABA neurons and increased by a factor of two on the DA neuron. Thus, model
326 calibration predicts that the elevated firing rate and burstiness caused by coexpression of

327 nAChRs on both the GABA and the DA neurons, although attaining very similar values, rely in a
328 very different mechanism: The firing rate is increased due to a direct ACh-mediated excitation of
329 DA neurons, whereas GABA neuron influence augments bursting.

330 Nicotine application after re-expression of $\beta 2$ -containing nAChRs on both VTA DA and GABA
331 neurons produced increases in both firing rate and bursting of DA neurons in experiments (Fig.
332 2, purple). To model this case, nicotinic input was applied to both DA and GABA neurons.
333 Resulting DA neuron firing rate is produced by a competition between nicotine-evoked direct
334 excitation and GABA-mediated inhibition. We used the same parameters as in the case of ACh
335 influence on both neurons above. The overall increase in DA neuron firing rate was achieved due
336 to a stronger direct excitation of DA neurons than their inhibition through GABA neurons by
337 nicotine (Fig. 6 purple). However, as it follows from the case of nAChRs re-expression only on
338 DA neurons, this pathway cannot be implicated in increasing bursting of the DA neurons. The
339 mechanism for increasing bursting combines the increase in direct excitation and GABA neuron-
340 mediated inhibition of DA neurons. We have shown that this combination effectively increases
341 DA neuron bursting as spikes within bursts are more resistant to inhibition than those without
342 (Morozova et al., 2016a; DiVolo et al., n.d.). Thus, increased firing rate and bursting of DA
343 neurons induced by nicotine application through $\beta 2$ -containing nAChRs suggests the
344 convergence of both direct excitation and GABA-mediated inhibition with the latter having a
345 weaker influence.

346

347 **A combination of nicotinic activation of $\beta 2$ -containing nAChRs on VTA neurons and Glu**
348 **projections underlies modulation of DA neuron firing in wild type mice**

349 Re-expression of β 2-containing nAChRs on all VTA neurons supposedly restores the influence
350 of ACh and nicotine within, but not outside of the VTA. Therefore, some distinctions from firing
351 rates and patterns of DA neurons in WT mice may remain. In the absence of nicotine, the firing
352 rate and bursting of DA neurons in WT mice are not statistically different from that in the whole
353 VTA re-expression case (Fig. 1 black). However, nicotine application increases bursting and
354 firing rate to greater levels in WT compared to the whole VTA re-expression case (Fig. 2 black).
355 In simulations, we use the same conductances of the nAChRs on both DA and GABA neurons as
356 in the double re-expression case above. To account for nicotinic modulation in other brain
357 regions as the nAChRs are preserved throughout the brain, we increase the average frequency of
358 Glu afferents from 50 to 60Hz for the duration of the nicotine injection. The increase caused
359 greater DA neuron firing rates and bursting compared to double re-expression case (Fig. 6 black;
360 compare to purple) during nicotinic excitation of the receptors, matching the experimental
361 results. Therefore, a combination of modulations produced by nicotine inside and outside of the
362 VTA allows us to reproduce the impact of nicotine administration on the firing properties of the
363 VTA DA neurons.

364

365 **Discussion**

366 The above results provide essential details of how nicotine impacts the drug reinforcement-
367 related circuitry in the VTA. The amplified phasic DA output of the circuit requires concerted
368 activation of β 2-nAChRs on both DA and GABA neurons in the VTA (Tolu et al., 2013). Our
369 modeling suggests that direct excitation of DA neurons by endogenous ACh via nAChRs is not
370 enough to increase bursting. In fact, co-activation of GABA neurons via the same receptor
371 activation does not exert the suggested inhibitory influence, but is necessary for bursting. The

372 mechanism that allows us to reproduce the experimental results is the modulation of synchrony
373 levels in the VTA GABA neural population. Synchronization among GABA neurons produces
374 pulsatile hyperpolarizing input to the DA neurons that increases their firing and bursting
375 (Morozova et al., 2016a). A pulsatile GABA input dynamically reduces long-lasting intrinsic
376 inhibition (Ca^{2+} -dependent K^{+} currents), and the pulsatile pattern of the external inhibition
377 allows the DA neurons to escape it and fire spikes between the pulses. This promotes the
378 occurrence of extra DA neuron spikes via phasic disinhibition. On the contrary, a
379 desynchronized GABA population provides nearly constant level of inhibition to DA neurons,
380 which suppresses their firing. The difference in synchrony can be produced by ACh input vs.
381 nicotinic injection. Due to fast transient activation of $\beta 2$ -nAChRs, ACh pulses can act as
382 synchronizing inputs to these GABA neurons. By contrast, nicotine persistently activates
383 nAChRs, causing an increase in the frequency without synchronizing the GABA population.
384 This study highlights the role of GABA interneurons, and in particular, the temporal pattern of
385 their activity, in the regulation of DA neurons bursting.

386 Our modeling has reconciled apparent controversies of complex cholinergic and nicotinic
387 modulation of the VTA DA neuron firing rate and pattern. First, systemic KO of $\beta 2$ -nAChRs
388 drastically reduces bursting of DA neurons. DA neuron bursting have been shown to depend on
389 the Glu inputs (Morikawa et al., 2003; Blythe et al., 2007; Deister et al., 2009) and has a major
390 behavioral function as an unexpected reward signal (Schultz, 2002; Tobler et al., 2005).
391 However, Glu inputs to VTA in the $\beta 2$ -nAChRs KO mice likely remain intact and suffer only
392 minor changes in their activity as they are mostly modulated by the $\alpha 7$ -containing nAChRs
393 (Koukouli and Maskos, 2015). Further, re-expression of nAChRs within VTA restores high
394 bursting levels. What is the mechanism that allows ACh to modulate bursting of the DA

395 neurons? Our modeling shows that without β 2-nAChRs, Glu excitation of VTA DA neurons
396 remains in balance with inhibition mediated by neighboring VTA GABA neurons. Both neural
397 groups receive partly overlapping Glu projections (Beier et al., 2015), and this may help preserve
398 the balance throughout different behavioral states. ACh inputs to VTA break the inhibition-
399 excitation balance and, consequently, increase VTA DA neuron bursting. This make the
400 motivation and saliency signals carried by DA bursting to be vulnerable to the influence of
401 nicotine and other substances affecting β 2-nAChRs.

402 Second, a straight-forward way to restore DA neuron activity does not work: re-expression
403 of nAChRs on the DA neuron does not elevate its bursting and increases its firing rate only under
404 the influence of nicotine. Why direct excitation through β 2-nAChRs does not restore DA neuron
405 activity? The answer may be in the similarity of the β 2-nAChRs to other types of excitatory
406 receptors that do not have voltage dependence: When driven by Glu inputs, DA neurons are most
407 responsive to activation of their NMDA receptors (Overton and Clark, 1992; Chergui et al.,
408 1993; Deister et al., 2009). By contrast, AMPA receptors are much less effective in eliciting
409 bursts. The receptor difference that has been shown to be critical is the voltage dependence of the
410 NMDA receptor: it is blocked by magnesium ions at lower voltages (Deister et al., 2009). This
411 blockade allows the cell to repolarize and go into the next oscillation, whereas activation of the
412 AMPA receptor does not allow for the repolarization and block oscillations all together. Similar
413 to AMPA and distinct from NMDA receptors, β 2-nAChRs do not have voltage dependence.
414 Therefore, ACh input to DA neurons by itself is not effective in driving their bursting. This
415 direct excitation can, however, significantly increase the DA neuron firing rate, which occurs
416 under the influence of nicotine.

417 Third, ACh input and nicotinic application result in opposite changes in VTA DA neuron
418 firing when β 2-nAChRs are re-expressed only on VTA GABA neurons. In particular, the firing
419 rate and especially bursting of VTA DA neurons are sharply increased after the re-expression
420 compared to the KO conditions. Application of nicotine, by contrast, decreases their firing rate
421 and bursting. How these modulations can be reconciled? Our model uses the difference in the
422 temporal pattern of receptor activation under the influence of ACh input vs. nicotine: While ACh
423 input produces pulsatile activation of the receptor, nicotine-induced activation is continuous and
424 long-lasting. A pulsatile input to the VTA GABA population can synchronize its firing and make
425 its output to the DA neurons pulsatile as well. Again, such pulsatile inhibition of DA neurons
426 may boost their bursting (Morozova et al., 2016a). Therefore, we predict that the opposite
427 influence of ACh and nicotine through β 2-nAChRs on GABA neurons is caused by distinct
428 temporal structure of the stimulation: pulsatile vs. continuous.

429 In the experiments, the modulations of DA neuron firing introduced with re-expression of
430 β 2-nAChRs on both DA and VTA GABA neurons closely reproduce that in WT mice under
431 endogenous ACh inputs. However, these double re-expression experiments do not completely
432 reproduce those in the WT mice during nicotine application. In particular, both firing rate and
433 bursting evoked by nicotine are higher in the WT case (Fig. 2 and 6). One possibility is that this
434 difference is due to altered expression of the receptors inside the VTA. It is plausible that the re-
435 expression levels could be different in these conditions. However, the difference between the
436 case of re-expressing the receptors in all VTA neurons and the WT occurs only during nicotine
437 application. Therefore, we assume that this difference is due to the expression of β 2-nAChRs
438 outside of the VTA, which is not rescued by the re-expression. We assume that nicotine
439 increases cortical activity in the WT mice greater than in the β 2 KO mice consistent with

440 nicotine-induced activation of β 2-nAChRs receptors on deep layer pyramidal neurons (Toyoda,
441 2018) and on the disinhibitory interneurons in the superficial cortical layers (Koukouli et al.,
442 2017). We reproduced the elevated firing rate and bursting of DA neurons during nicotine
443 application in the WT model with a modest increase in the average firing rate of Glu afferents to
444 the VTA for the duration of nicotine application.

445 Note that we did not have to assume that the Glu input to the VTA changes its temporal
446 structure under the manipulations performed experimentally. We propose a local VTA circuit
447 mechanism for the changes in the DA cell activity. Previous modeling work has shown that the
448 Glu afferent input that has a bursty temporal structure also increases the burstiness of the DA
449 neuron (Morozova et al., 2016a). It is known that α 7-containing nAChRs modulate Glu inputs to
450 the VTA (Schilström et al., 1998, 2000, 2003) and impact DA neuron bursting in a subtle manner
451 (Mameli-Engvall et al., 2006): β 2-nAChRs appeared to exert an overwhelming control over all
452 bursting under ACh and nicotine, while the α 7-nAChRs manipulations in β 2 intact animals
453 affected bursting in a subpopulation of DA neurons with relatively low mean firing rates. These
454 previous results suggest that α 7-nAChRs have impact on bursting, but in a manner that is
455 strongly controlled by the β 2-nAChRs. Previous data suggests that deletion of α 4 or α 6 subunits
456 do not cause significant changes in firing and bursting of DA neurons (Exley et al., 2011).
457 Therefore, different subtypes of nAChRs may control different sources of DA neuron bursting
458 and, therefore, motivational and saliency signals associated with this bursting. However, in the
459 experiments considered in the present study, the α 7-nAChRs were not modulated. Hence, we
460 must conclude that the changes we see in DA cell activity are due to β 2-nAChR effects.

461 Previous results suggested that the co-activation of VTA DA and GABA neurons is
462 required for the habit-forming effects of nicotine. How does the mechanism revealed in this

463 paper explain the requirement of GABA neuron activation? The co-excitation of DA and GABA
464 neurons constitute the conditions in which DA neuron bursting is maximized in the model.
465 Indeed, excitation of DA neurons only can elevate their firing rate, but does not group spikes into
466 bursts. We predict that the additional excitation of the GABA neurons increases bursting it two
467 ways: First, the tonic component of the inhibition mostly cancels the spikes without rather than
468 within bursts. This mechanism contributes most during nicotine application. Second, excitation
469 of GABA neurons by common inputs may also synchronize their firing and further promote
470 bursting by providing pulsatile inhibition to DA neurons. This is a mechanism that provides
471 background ACh- but not nicotine-driven DA neuron bursting because nicotine blunts the
472 temporal profile of β 2-nAChRs activation, and, thus, destroys synchronous pulses of GABA
473 inhibition. Therefore, co-activation of DA and GABA neurons is required for DA neuron
474 bursting and, thus, motivation and saliency signals carried by these bursts, which are hijacked by
475 nicotine and other addictive drugs.

476

477 **References**

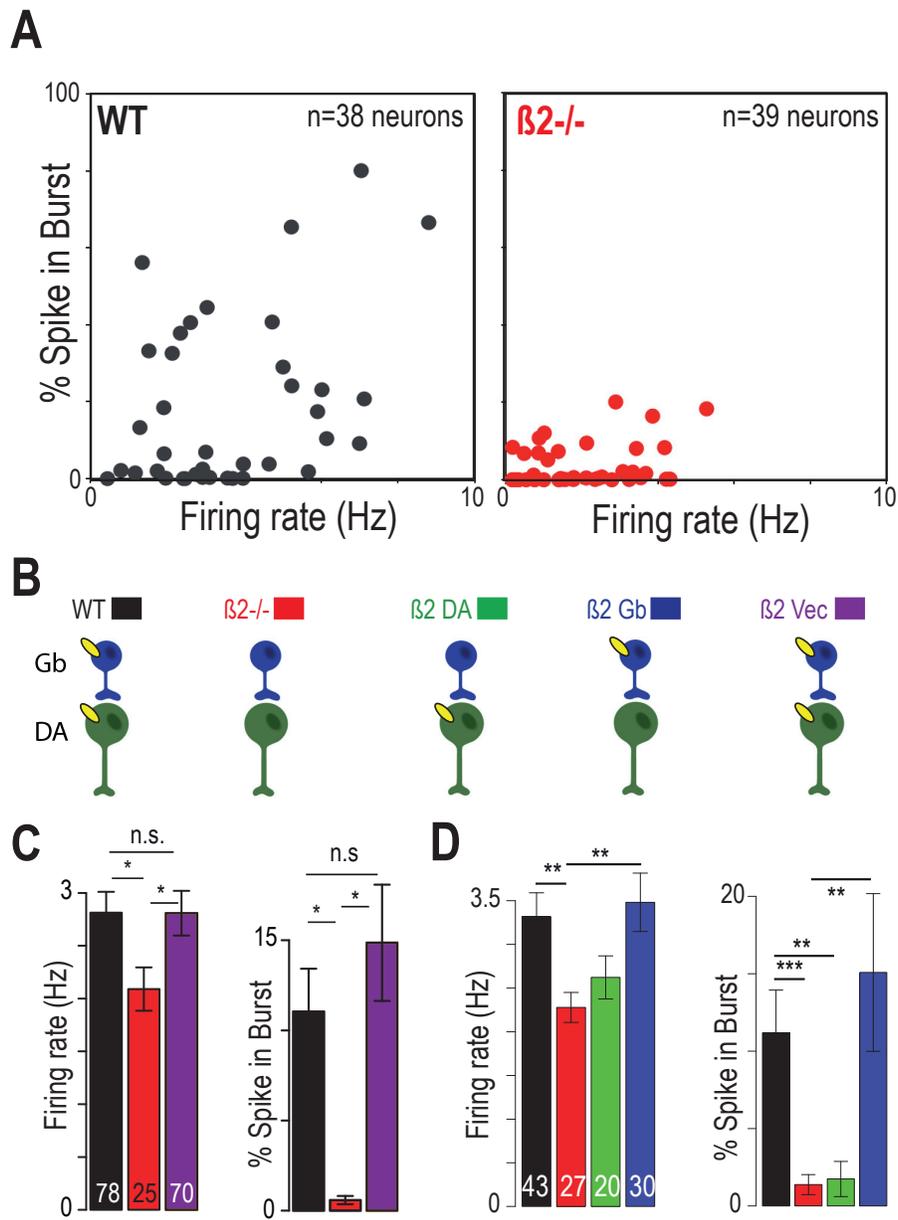
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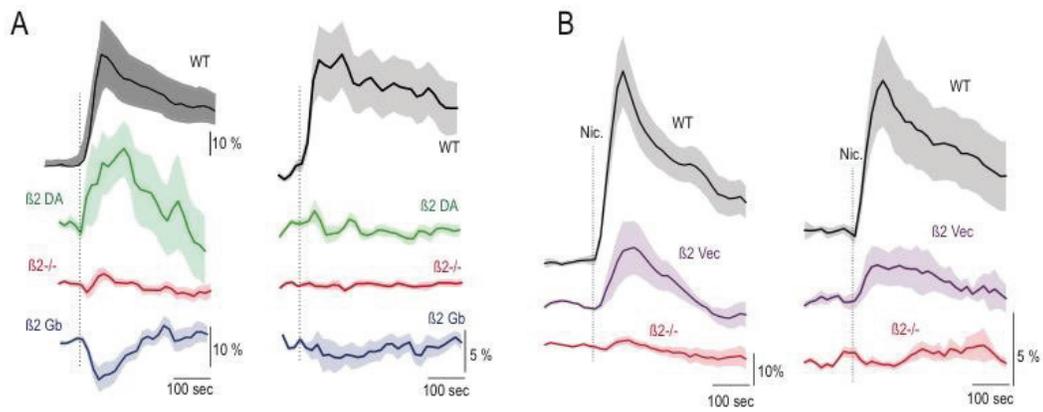
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629 Figure 1. Quantification of firing rate and pattern of the VTA DA neurons in wild type (WT,
 630 black), after systemic deletion of $\beta 2$ -containing nAChRs (red), and their subsequent re-
 631 expression on VTA DA (green), VTA GABA (blue), and on both neurons (purple). (A) Mean

632 firing frequency (Hz) against percentage of spikes within a burst (%SWB) for n = 38 and 39
633 individual cells in WT and $\beta 2$ KO mice. Systemic deletion of $\beta 2$ -containing nAChR decreases
634 both DA neuron firing rate and bursting compared to WT (see also C and D). (B) Various KO
635 and re-expression cases that have been used to analyze the role of $\beta 2$ -containing nAChRs in the
636 VTA (see methods and C, D)). (C) lentiviral re-expression of $\beta 2$ subunit in the VTA of $\beta 2$ KO
637 mice using a ubiquitous mouse phosphoglycerate kinase (PGK) promoter ($\beta 2$ Vec) restores firing
638 rate and bursting (Data modified from **(Naudé et al., 2016)**). (D) Comparison of firing rate and
639 bursting in WT (black), $\beta 2$ KO mice ($\beta 2^{-/-}$, red) and mice with re-expression of $\beta 2$ in a specific
640 neuronal population. Cre recombinase-activated lentiviral expression vector were used to drive
641 specific $\beta 2^*$ -nAChR re-expression in DA or GABAergic neurons of the VTA of DAT Cre mice
642 ($\beta 2$ DA, green), GAD67 Cre mice ($\beta 2$ Gb, red). (Data from (Tolu et al., 2013))

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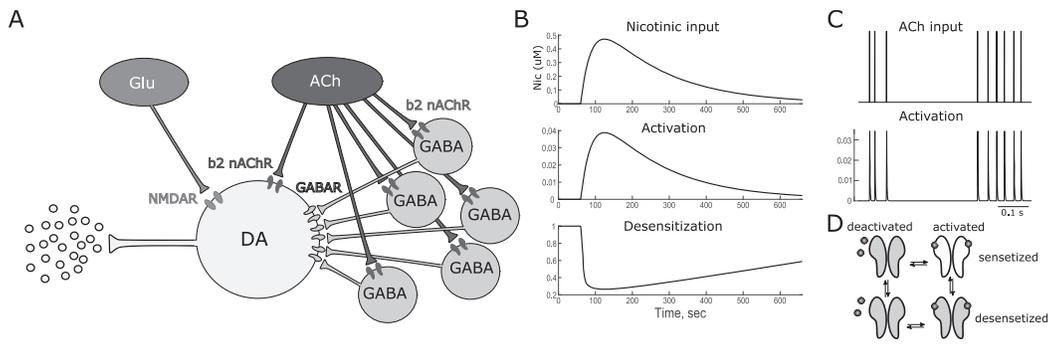


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646 Figure 2. Comparison of the nicotine-elicited modifications of the firing rate (left) and %SWB
 647 (right) in VTA DA neurons in in two set of experiments (A) $\beta 2$ DA vector (green) and $\beta 2$ Gb
 648 vector (blue) compared to wild type (black) and $\beta 2^{-/-}$ (red) mice (Data modified from (Tolu et
 649 al., 2013)). (B) $\beta 2$ -Vec (purple) compared to wild type (black) and $\beta 2^{-/-}$ (red) mice (Data
 650 modified from (Naudé et al., 2016)). Vertical dashed line indicates the nicotine injection.

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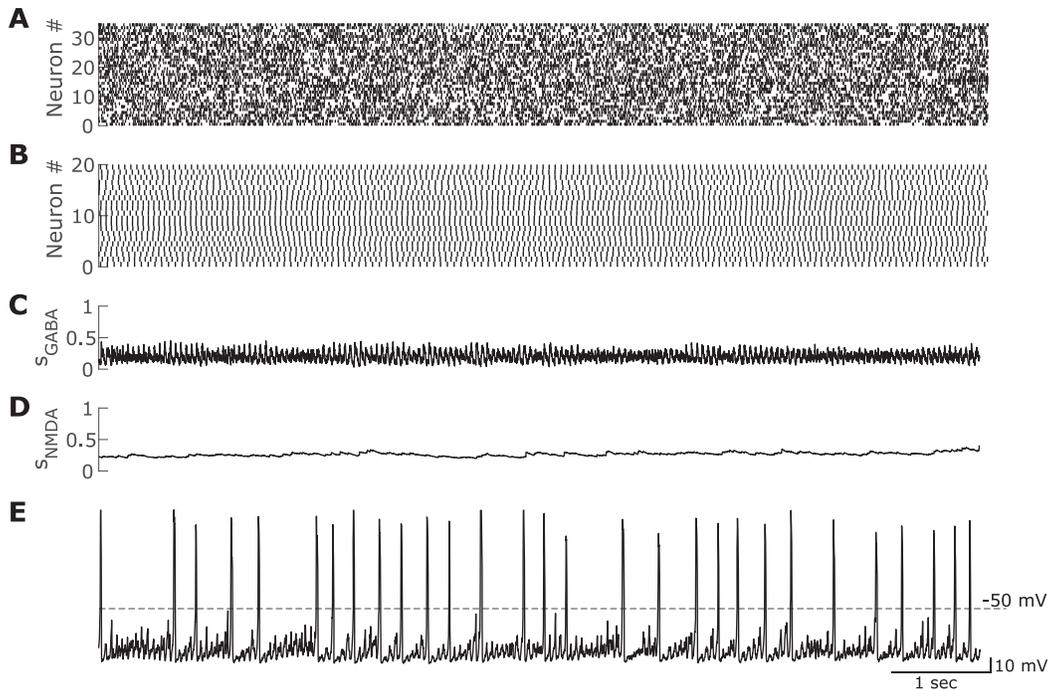
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654 Figure 3. Schematic of the model. (A) Afferent inputs and microcircuitry of the VTA. (B) Time
 655 course of the nicotine concentration and subsequent activation and desensitization of nAChRs.

656 (C) Temporal profile of ACh input and subsequent activation of nAChRs (D) State transitions of
 657 the nAChRs.

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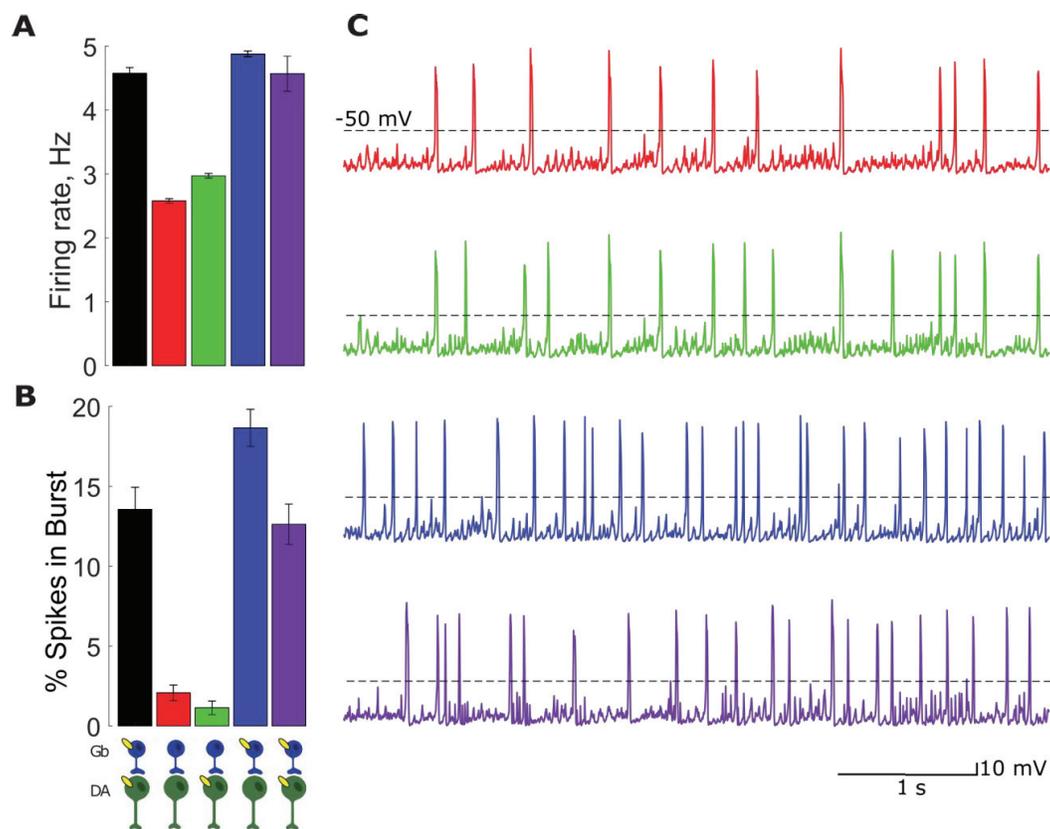


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661 Figure 4. The rate and regularity of the DA neuron firing receiving asynchronous synaptic
662 Glu and GABA inputs. (A) Glu raster. (B) GABA raster. (C) Activation of the GABAR on
663 the DA neuron. (D) Activation of the NMDAR on the DA neuron. (E) The voltage of the DA
664 neuron. Note the high regularity of DA neuron firing.

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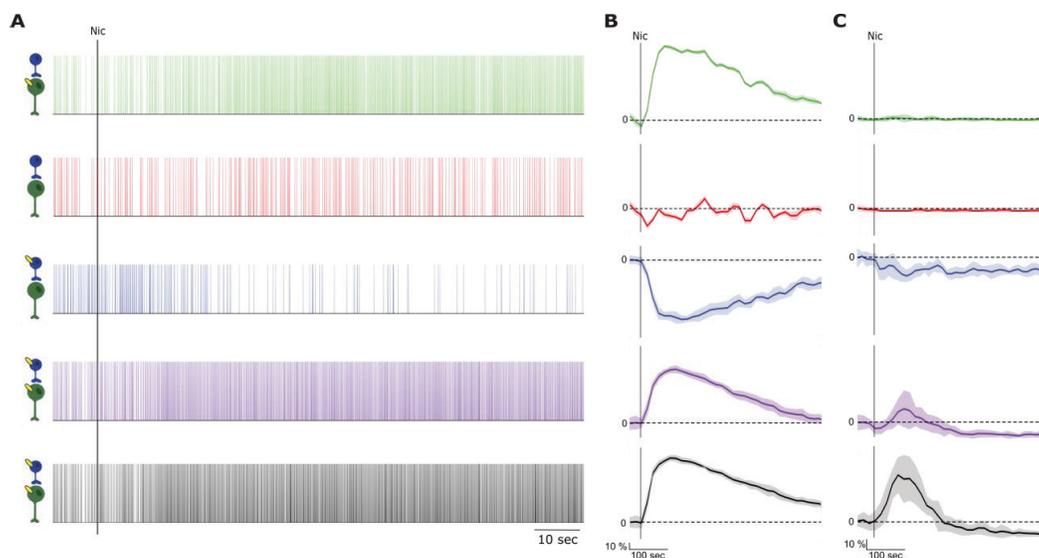


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668 Figure 5. Quantification of spontaneous firing of simulated DA neurons. (A) Bar-plot
 669 representation of the mean basal firing rate, represented as means \pm s.e.m, WT case (black), KO
 670 (red), β 2-containing nAChRs on DA neurons (green), the nAChRs on GABA neurons (blue) and
 671 the nAChRs on DA and GABA neurons (purple). (B) and mean %SWB B) Bar-plot
 672 representation of the mean %SWB, represented as means \pm s.e.m, KO (red), the nAChRs on DA
 673 neurons (green), the nAChRs on GABA neurons (blue) and the nAChRs on DA and GABA
 674 neurons (purple). (C) Example voltage traces of simulated DA neurons under 4 different
 675 conditions indicated in (A) and (B). Colors of the voltage traces matches colors of the bars.
 676 Inclusion of nAChR-mediated ACh current to GABA neurons significantly increased DA neuron

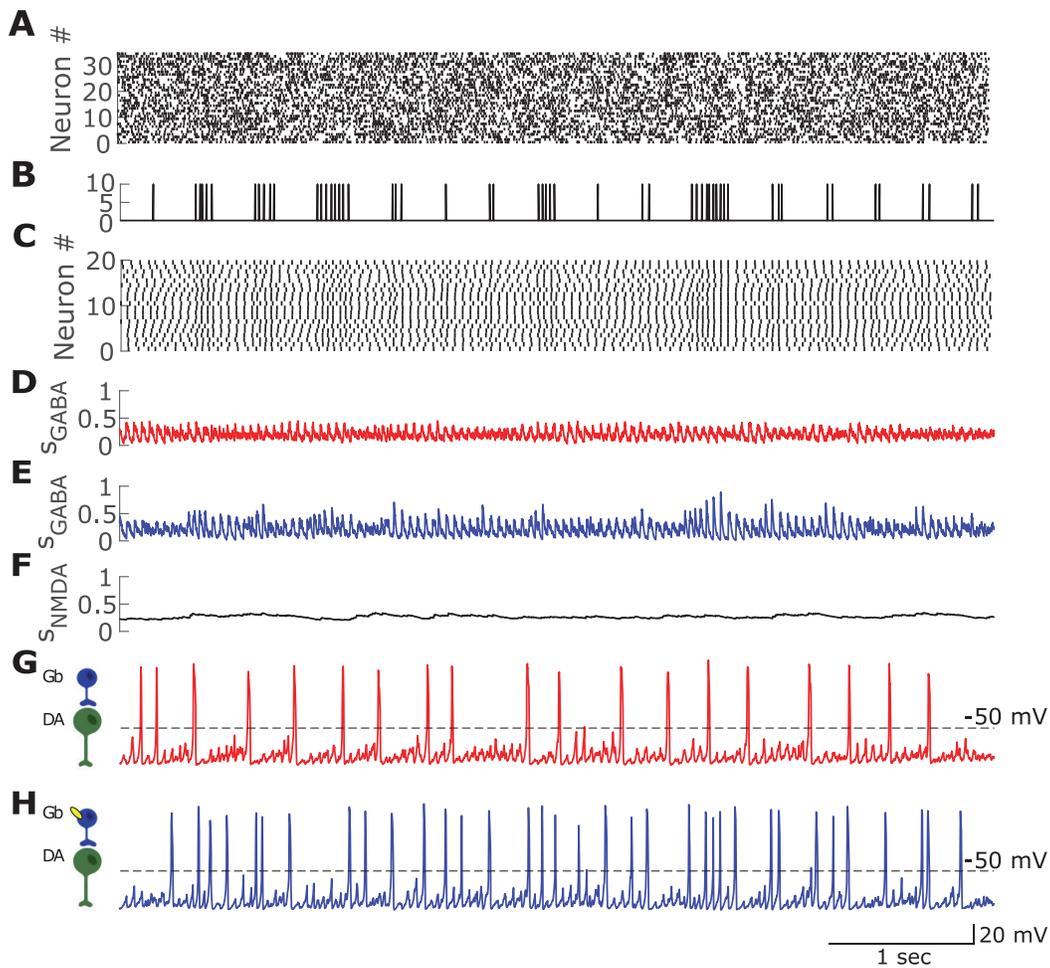
677 firing and bursting similarly to the experiment (Tolu et al., 2013). See extended data Fig. 6-1 for
678 parametric analysis.
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682 Figure 6. Nicotine-elicited changes in firing rate and burstiness of simulated DA neuron. (A)
 683 Raster plots of DA neuron firing in response to nicotine, KO (red), β 2-containing nAChRs on
 684 DA neurons (green), the nAChRs on GABA neurons (blue), the nAChRs on DA and GABA
 685 neurons (purple), and WT case (black). (B) and (C) Nicotine-elicited changes in firing rate (B)
 686 and %SWB (C) of simulated DA neurons in response to nicotine. Vertical black line shows the
 687 onset of the nicotinic input. There is no change in DA neurons firing or bursting in response to
 688 nicotine if both DA or GABA neurons lack the receptors (red). Nicotine increases DA neuron
 689 firing if β 2-nAChR is added only to DA neuron (green). Oppositely, it decreases DA neuron
 690 firing and bursting if β 2-nAChR is added only to GABA neurons (blue). Interestingly, nicotine
 691 increases DA neuron firing and bursting if β 2-nAChRs are added to both neurons (purple).
 692 Nicotine elicits even greater response in WT-like case, due to the nicotine-elicited increase in
 693 frequency of Glu inputs to the DA neurons (black). See extended data Fig. 6-1 for parametric
 694 analysis.



695

696 Figure 7. Bursty pulsatile cholinergic input transiently synchronizes GABA neurons.

697 Synchronous GABA input evokes additional DA spikes and increases DA neuron burstiness. (A)

698 Raster of Glu neurons. (B) ACh input. (C) Raster of VTA GABA neurons. (D) and (E) show the

699 cumulative activation variable of the GABAR current on DA neurons without (red) and with

700 (blue) ACh input. (F) shows the activation variable of the NMDAR current on the DA neuron.

701 Note the lack of significant variations. (G) and (H) are voltages of the DA neuron in the cases

702 they receive GABAR activation from panel (D) or (E) respectively. Note a greater number of
703 spikes grouped in bursts when the nAChR is added to the GABA neurons (blue).
704

705 **Extended Data**

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707 Table 1-1: Model parameters

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Parameter	Description	Value
c_m	Membrane capacitance	$1\mu F / cm^2$
\bar{g}_K	Potassium conductance	$1mS / cm^2$
\bar{g}_{Ca}	Calcium conductance	$2.5mS / cm^2$
\bar{g}_{KCa}	Calcium-dependent potassium conductance	$7.8mS / cm^2$
\bar{g}_{sNa}	Subthreshold sodium conductance	$0.13mS / cm^2$
g_{leak}	Leak conductance	$0.18mS / cm^2$
E_K	Potassium reversal potential	$-90mV$
E_{Ca}	Calcium reversal potential	$50mV$
E_{Na}	Sodium reversal potential	$55mV$
E_{leak}	Leak reversal potential	$-35mV$
E_{NMDA}	NMDA reversal potential	$0mV$
E_{AMPA}	AMPA reversal potential	$0mV$
E_{GABA}	GABA reversal potential	$-90mV$
τ_{aact}	AMPA receptor activation time	$1ms$
τ_{adeact}	AMPA receptor deactivation time	$1.6ms$

τ_{ades}	AMPA receptor desensitization time	$6.1ms$
$\tau_{adesrel}$	AMPA receptor release from desensitization time	$40ms$
τ_{nact}	NMDA receptor activation time	$7ms$
τ_{ndeact}	NMDA receptor deactivation time	$170ms$
τ_{gact}	GABA receptor activation time	$0.08ms$
τ_{gdeact}	GABA receptor deactivation time	$10ms$

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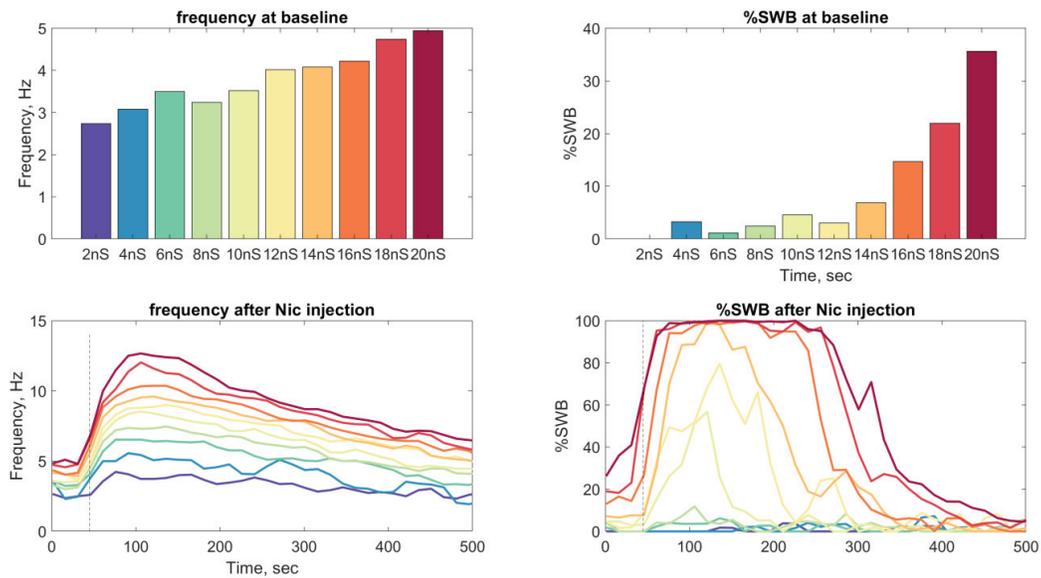
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725 Parametric analysis of DA neuron firing

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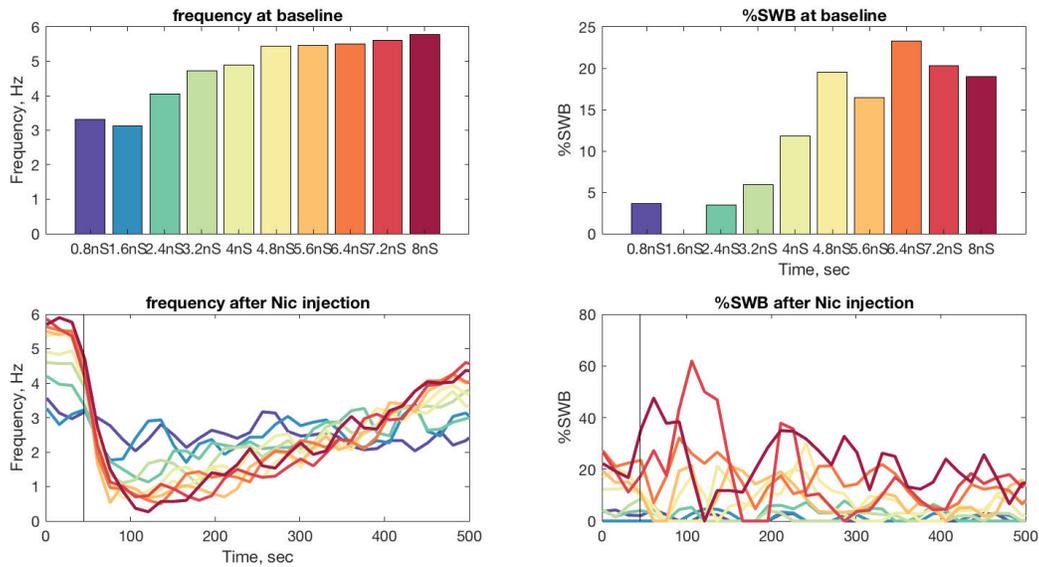
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728 Figure 5-1: Parametric analysis of DA neuron responses to ACh and nicotinic inputs for different

729 maximal conductances of nAChR current (mimicking different levels of expression of nAChRs)

730 on DA neurons. The range of low nAChR conductances gives a good correspondence with the

731 experimental data.



732

733 Figure 6-1: Parametric analysis of DA neuron responses to ACh and nicotinic inputs for different
 734 maximal conductances of nAChR current (mimicking different levels of expression of nAChRs)
 735 on GABA neurons. The range of low nAChR conductances on GABA neurons gives a good
 736 correspondence with the experimental data.