Striatal fast-spiking interneurons: from firing patterns to postsynaptic impact

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In the striatal microcircuit, fast-spiking (FS) interneurons have an important role in mediating inhibition onto neighboring medium spiny (MS) projection neurons. In this study, we combined computational modeling with *in vitro* and *in vivo* electrophysiological measurements to investigate FS cells in terms of their discharge properties and their synaptic efficacies onto MS neurons. *In vivo* firing of striatal FS interneurons is characterized by a high firing variability. It is not known, however, if this variability results from the input that FS cells receive, or if it is promoted by the stuttering spike behavior of these neurons. Both our model and measurements *in vitro* show that FS neurons that exhibit random stuttering discharge in response to steady depolarization do not show the typical stuttering behavior when they receive fluctuating input. Importantly, our model predicts that electrically coupled FS cells show substantial spike synchronization only when they are in the stuttering regime. Therefore, together with the lack of synchronized firing of striatal FS interneurons that has been reported *in vivo*, these results suggest that neighboring FS neurons are not in the stuttering regime simultaneously and that *in vivo* FS firing variability is more likely determined by the input fluctuations. Furthermore, the variability in FS firing is translated to variability in the postsynaptic amplitudes in MS neurons due to the strong synaptic depression of the FS-to-MS synapse. Our results support the idea that these synapses operate over a wide range from strongly depressed to almost fully recovered. The strong inhibitory effects that FS cells can impose on their postsynaptic targets, and the fact that the FS-to-MS synapse model showed substantial depression over extended periods of time might indicate the importance of cooperative effects of multiple presynaptic FS interneurons and the precise orchestration of their activity.

Keywords: stuttering discharge, parvalbumin-positive interneuron, medium spiny projection neuron, synaptic depression, cortex

1 INTRODUCTION

Striatal fast-spiking (FS) interneurons provide strong inhibitory input to medium-sized spiny (MS) projection neurons (Koós and Tepper, 1999; Tepper et al., 2004, 2008; Mallet et al., 2005; Gustafson et al., 2006). The proximal location of FS-to-MS synapses enables FS neurons to influence MS activity – either by delaying or by totally suppressing spike generation in MS cells (Tepper et al., 2004, 2008). Despite their small number in the striatum (~1%; Kita et al., 1990; Luk and Sadikot, 2001), FS interneurons are therefore able to shape the output of the striatum to the downstream nuclei of the basal ganglia.

The discharge of striatal FS neurons in awake, behaving animals is characterized by irregular fluctuations of the instantaneous firing rate with numerous high-frequency bursts, single spikes, and

periods of silence (Berke et al., 2004; Berke, 2008; Gage et al., 2010). It is currently not known if and to which extent FS firing variability is determined by the input that these neurons receive under natural conditions. An additional source of the firing variability could originate from intrinsic cellular mechanisms that underlie the irregular, random bursting ("stuttering") in FS neurons. Stuttering spike behavior is characterized by a variable number of spikes per burst and a variable interburst interval (**Figure 1B**). Since stuttering discharge has only been reported *in vitro* in response to somatic step currents (Kawaguchi, 1993; Gupta et al., 2000; Koós and Tepper, 2002; Bracci et al., 2003; Tepper et al., 2004; La Camera et al., 2006; Druckmann et al., 2007; Taverna et al., 2007), we in this study systematically investigated the effect of fluctuating and steady input on FS firing patterns in a model and *in vitro*. Indeed, we observed random stuttering only in response to steady input. In this regime, however, our model predicts a significant amount of spike synchronization among electrically coupled FS cells, which is in contrast to the lack of synchronized spiking among striatal FS interneurons *in vivo* (Berke, 2008). Conversely, when driven by fluctuating input, FS model neurons showed reliable spike timing

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Abbreviations: f_{AMPA}, Total input frequency for AMPA synapses in the model; f_{GABA}, Total input frequency for GABAergic synapses in the model; ISI, Interspike interval; PSP, Postsynaptic potential; q_{DC}, Fraction of steady current injection in the input. For synaptic input, q_{DC} is zero whereas a step current corresponds to q_{DC} equal to unity; V_m, Average subthreshold membrane potential between the action potentials in a firing neuron. The membrane potential from 10 ms before to 2 minimum interspike intervals after each spike was excluded for the estimation of V_m.

and no spike synchronization. Therefore, these results suggest that in the awake, behaving animal, neighboring striatal FS interneurons are not in the stuttering regime simultaneously and that the high *in vivo* FS firing variability is more likely determined by the input fluctuations.

High firing rates of striatal FS interneurons *in vivo* (Berke, 2008, 2011) and the synaptic depression in FS-to-MS synapses (Plenz and Kitai, 1998; Koós et al., 2004; Gittis et al., 2010; Planert et al., 2010) cause changes in FS firing patterns to affect the synaptic strength of these synapses. This will ultimately modify the impact that FS cells have over MS firing, and thus, over striatal output. We therefore investigated how *in vivo* firing patterns in striatal FS interneurons influence the amplitude distribution of PSPs in MS cells. Our FS-to-MS synapse model predicted that these synapses are strongly depressed over extended periods of time. Despite the lack of general FS spike synchronization *in vivo*, this result suggests that the combined inhibition mediated by multiple presynaptic FS cells might be required to effectively shape the activity of MS projection neurons.

2 MATERIALS AND METHODS

2.1 THE NEURON MODEL

Parvalbumin-positive FS interneurons have been characterized by their immunochemical, morphological, and electrophysiological properties in both striatum (Kawaguchi, 1993, 1997; Taverna et al., 2007) and cortex (Kawaguchi and Kubota, 1997; Markram et al., 2004). Despite some striking differences in the organization of the cortical and striatal microcircuits, in which they are embedded, these neurons show many similarities in both areas, including a similar electrophysiological signature (see references above), a common developmental origin (Marín et al., 2000) and the coupling via gap junctions (Galarreta and Hestrin, 1999; Koós and Tepper, 1999; Beierlein et al., 2000; Amitai et al., 2002; Fukuda, 2009). Therefore, to model the stuttering in striatal FS interneurons, we used the channel descriptions of a previously published cortical one-compartment model (Golomb et al., 2007). This model contained the following voltage-dependent ionic channels, which have also been reported to be expressed in the rat striatum (Lenz et al., 1994; Weiser et al., 1994; Chung et al., 2000; Kotaleski et al., 2006): a fast Na^+ window current (I_{Na}), a fast delayed rectifier K^+ current (I_{Kdr}), and a slowly inactivating (d-type) K^+ current (I_{Kd}). The d-type current has been shown to delay spike initiation (Goldberg et al., 2008), which is also observed in many striatal FS interneurons (Plenz and Kitai, 1998). With a small Na^+ window current and a sufficiently large d-type K^+ current, the model was able to generate the typical subthreshold oscillations (40–50 Hz) and stuttering episodes in response to somatic current injections as observed in striatal FS interneurons (**Figure 1**). In the current study, the half-maximum potential for the sodium current was $\theta_m = -22$ mV and the d-type conductance was $g_{KD} = 1.6$ mS/cm^2 (**Table 1**, see also Golomb et al., 2007). Some experiments were also performed with a model neuron that produced tonic discharge ($\theta_m = -28$ mV, $g_{KD} = 0.39$ mS/cm^2, see **Figures A2 and A3** in Appendix). To induce oscillatory fluctuations in the subthreshold membrane potential during the interburst episodes, a Gaussian white noise current with zero mean and 15 pA SD (0.1 ms time step) was applied to the model neuron (Golomb et al., 2007).

In order to model distal synaptic input and dendritic gap junctions, we extended the original one-compartment model of Golomb et al. (2007) by a dendritic tree consisting of three identical subtrees (cf. Kotaleski et al., 2006). Each subtree comprised one primary, two secondary, and four tertiary dendrites (i.e., each of the primary and secondary dendrites branched into two daughter arms). To allow for the same high firing rates as in the original one-compartment model, we increased the active conductances by a factor of 2 in the morphologically extended model, and in addition assumed active primary dendrites. Detailed model cell parameters are shown in **Table 1**.

We used a single FS model neuron for the simulation of the responses to fluctuating input, and a pair of FS model cells for the study of electrical coupling in these neurons. To be able to use parallel computing for the simulation of the FS cell pair, we implemented the FS model in Parallel GENESIS (Bower and Beeman, 1998) with a fixed step size of 10 μs. The model implementation can be obtained from http://senselab.med.yale.edu/modeldb/showmodel.asp?model=140254
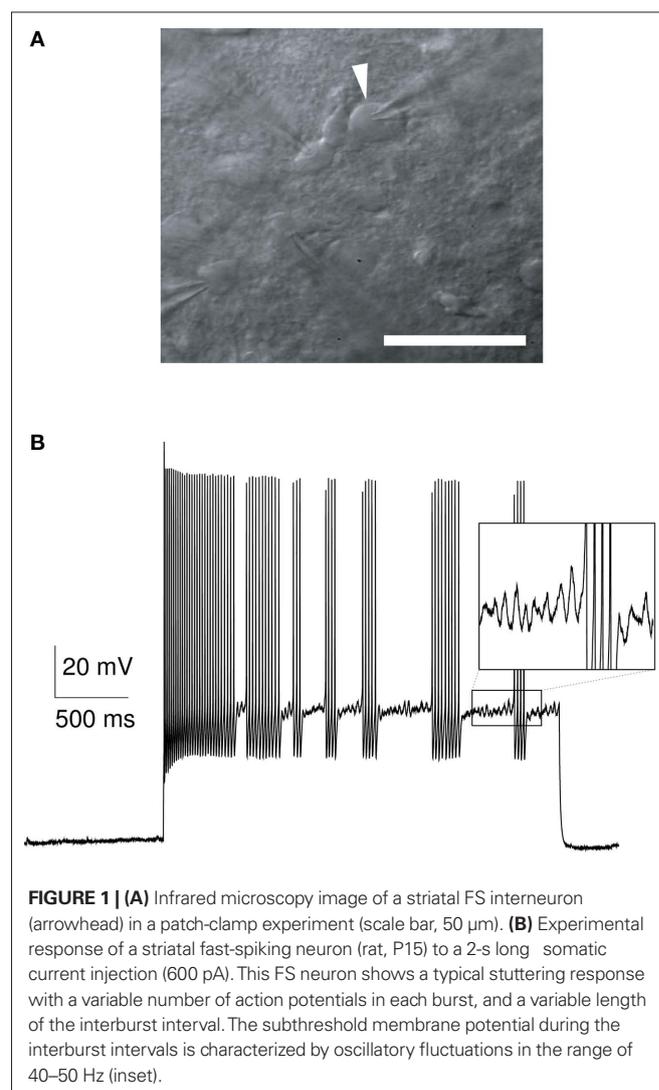
FIGURE 1 | (A) Infrared microscopy image of a striatal FS interneuron (arrowhead) in a patch-clamp experiment (scale bar, 50 μm). **(B)** Experimental response of a striatal fast-spiking neuron (rat, P15) to a 2-s long somatic current injection (600 pA). This FS neuron shows a typical stuttering response with a variable number of action potentials in each burst, and a variable length of the interburst interval. The subthreshold membrane potential during the interburst intervals is characterized by oscillatory fluctuations in the range of 40–50 Hz (inset).

Table 1 | Parameters for the FS model neuron.

Morphology and channel conductances				
	Soma	**Primary dendrites**	**Secondary dendrites**	**Tertiary dendrites**
$n \times n_{comp}$	1×1	3×2	6×4	12×8
$l \times d$	$15 \times 15\ \mu m$	$90 \times 1\ \mu m$	$148 \times 0.75\ \mu m$	$240 \times 0.5\ \mu m$
g_{Na}	$225\ mS/cm^2$	$22.5\ mS/cm^2$	–	–
g_{KDR}	$450\ mS/cm^2$	$45.0\ mS/cm^2$	–	–
g_{KD}	$1.6\ mS/cm^2$	$0.16\ mS/cm^2$	–	–
g_{AMPA}	✓	✓	✓	✓
g_{GABA}	✓	✓	✓	–

The model cell consisted of a soma and three identical subtrees (one primary, two secondary, and four tertiary dendrites each). The soma and dendritic sections were specified by their total number n, their number of subcompartments n_{comp}, their sectional length l and their diameter d. The total number of compartments was 127 (Kotaleski et al., 2006). Specific membrane resistance, specific axial resistance, and specific membrane capacitance were set to $R_M = 12\ k\Omega\ cm^2$, $R_A = 200\ \Omega\ cm$, and $C_M = 0.7\ \mu F/cm^2$, respectively. The resting membrane potential was varied from −65 to −70 mV. The reversal potentials for Na⁺, K⁺, GABA, and AMPA were 50, −90, −60, and 0 mV, respectively. The half-maximum potential for the Na⁺ window current, θ_m, was set to −22 mV (Golomb et al., 2007).

2.2 SYNAPTIC INPUT AND ELECTRICAL COUPLING IN THE MODEL

The FS neuron model included α-amino-3-hydroxyl-5-methyl-4-isoxazole-propionate (AMPA) and fast γ-aminobutyric acid (GABA) synapses. Some tests were performed with additional *N*-methyl-ᴅ-aspartate (NMDA) synapses (not shown). The presented results did not depend on the presence or absence of NMDA synapses. All synapses received independent input in the form of random Poisson spike trains. AMPA synapses were distributed over all 127 compartments (Kotaleski et al., 2006). If NMDA synapses were present, they were located in the same compartments and received the same input as the AMPA synapses. GABA synapses were located more proximally, resulting in a total number of 31 inhibitory synapses (**Table 1**). *In vitro* measurements of spontaneous activity have shown that FS neurons receive a similar ratio between inhibitory and excitatory currents during an up-state (Blackwell et al., 2003). Therefore, to compensate for the smaller number of inhibitory synapses, the activation rate per GABA synapse was approximately threefold higher than for AMPA synapses. This was equivalent to using three GABA synapses per proximal compartment and activating them at the same rate as AMPA since we used the non-saturating synapse model *synchan* in Genesis. The time constants of the double-exponential function, which described the evolution of the synaptic conductances in this model, were $\tau_1 = 0.7$, $\tau_2 = 2$ ms for AMPA, $\tau_1 = 1.3$, $\tau_2 = 4$ ms for GABA, and $\tau_1 = 3.6$, $\tau_2 = 116$ ms for NMDA synapses, respectively (Hjorth et al., 2009).

Gap junctions between two FS neurons were modeled as conductive elements between the soma, the outer proximal dendrites, or the outer secondary dendrites. The conductance of a single gap junction was set to 0.5 nS, a value within the range of gap junction conductances in cortical FS neurons (Galarreta and Hestrin, 2002). A single soma-somatic gap junction resulted in a coupling coefficient of ~11% in our model, which was within the range of coupling coefficients reported in the striatum (Galarreta and Hestrin, 2001;

Koós et al., 2004). In order to obtain the same coefficient for the dendro-dendritic coupling, we increased the number of gap junctions on the primary and secondary dendrites to two and three, respectively.

2.3 MODELING OF THE FS-TO-MS SYNAPTIC DYNAMICS

For the FS-to-MS connections we used data from rat that was recently published by Planert et al. (2010). In short, synaptic connections were identified and characterized by stimulation of a presynaptic FS cell with a train (10, 20, or 40 Hz) of 8 strong and brief current pulses (0.5–2 nA, 3 ms), followed by a so-called recovery test pulse approximately 550 ms after the end of the train, all reliably eliciting action potentials (APs). Postsynaptic neurons were held near −80 mV to ensure strongly depolarizing responses to GABAergic input. For the analysis of synaptic properties, average postsynaptic traces over multiple repetitions were examined for the existence of synaptic responses (Planert et al., 2010).

The depressing synapse was modeled using a scheme described by Markram et al. (1998), where the synapse is assumed to have a limited amount of resources which are slowly restored over time (see also Tsodyks et al., 1998). The amplitude of a postsynaptic potential, PSP_n, in response to the *n*th AP in a spike train is a product of the fraction of available resources, R_n, and a facilitating utilization factor, u_n, scaled by the absolute synaptic efficacy, A_{se}:

$$PSP_n = A_{se}R_n u_n. \tag{1}$$

The utilization factor is increased by each AP and decays back toward U in the time between APs:

$$u_{n+1} = u_n \exp\left(-\frac{t_{ISI}}{\tau_F}\right) + U\left[1 - u_n \exp\left(-\frac{t_{ISI}}{\tau_F}\right)\right] \tag{2}$$

with $u_1 = U$. t_{ISI} denotes the time between the *n*th and $(n+1)$th AP. Each AP utilizes the fraction u_n from the synaptic resources, R_n, which then recovers to a value of 1 at a rate of τ_D:

$$R_{n+1} = R_n(1-u_n)\exp\left(-\frac{t_{ISI}}{\tau_D}\right) + 1 - \exp\left(-\frac{t_{ISI}}{\tau_D}\right), \tag{3}$$

with $R_1 = 1$. The parameters U, τ_D, and τ_F were fitted to the experimental traces using a two-step process. First, the amplitudes were extracted by fitting an exponential decay to the previous response and subtracting it from the new response. The second step in the parameter fitting performed a grid search (range 0–5 s for $\tau_{D,F}$ and 0–1 for U). The error was defined as the weighted sum of the absolute values of the amplitude difference at each peak between the reference trace and the modeled trace. The initial response and the recovery test response (RTR) were weighted five times stronger, and the second response was weighted by two. This was done to prevent the first set of inputs from dominating over the RTR. The parameters were fitted to a train of spikes at 20 Hz and verified for some synapses at 10 and 40 Hz (see **Figure A1** in Appendix).

2.4 SLICE PREPARATION AND EXPERIMENTAL RECORDINGS

All animal experiments were carried out according to the guidelines of the Stockholm municipal committee for animal experiments. Slices (300 μm thick) were obtained from rats on postnatal days

14 to 23, cut in ice-cold extracellular solution, kept at 35°C for 30 minutes, and then moved to room temperature before the recording. Whole-cell patch recordings were obtained at a temperature of 35 ± 0.5°C. Neurons were visualized using IR-DIC microscopy (Zeiss FS Axioskop, Oberkochen, Germany) as shown in **Figure 1A**. Recorded neurons were selected visually in cortex and striatum. In the striatum, neighboring cells with lateral somatic distances less than 100 μm were recorded simultaneously. MS neurons and fast-spiking interneurons were classified according to their typical membrane properties. The extracellular solution (both for cutting and recording) contained (in mM) 125 NaCl, 25 glucose, 25 NaHCO$_3$, 2.5 KCl, 2 CaCl$_2$, 1.25 NaH$_2$PO$_4$, 1 MgCl$_2$. Recordings were amplified using Axoclamp 2B or Multiclamp 700B amplifiers (Molecular Devices, CA, USA), filtered at 2 kHz, digitized (5–20 kHz) using ITC-18 (Instrutech, Port Washington, NY, USA), and acquired using Igor Pro (Wavemetrics, Lake Oswego, OR, USA). Patch pipettes were pulled with a Flamming/Brown micropipette puller P-97 (Sutter Instruments, Novato, CA, USA) and had an initial resistance of 5–10 MΩ, containing (in mM) 10 HEPES, 0.3 GTP-Na, and 10 Na$_2$-phosphocreatine. The intracellular solution furthermore contained either 110 K-gluconate, 10 KCl, and 4 ATP-Mg, or 110 K-gluconate, 10 KCl, 4 ATP-Na$_2$, and 4 MgCl$_2$, or 105 K-gluconate, 30 KCl, and 4 ATP-Mg. Chloride concentrations were increased for some connectivity experiments, as increasing internal chloride increases absolute synaptic current amplitudes. We did not observe differences in parameters describing the synaptic dynamics (not shown). All striatal FS responses reported in **Figure 3** were recorded with the last mentioned concentrations. In a subset of neurons, 0.2–0.5% biocytin was added. Liquid junction potential was not corrected for. Recordings were performed in current-clamp mode, with access resistance compensated throughout the experiments. Data was discarded when access resistance exceeded 35 MΩ.

2.5 STIMULATION PROTOCOL (GENERATION OF FLUCTUATING CURRENT INPUT)

We investigated the spiking pattern of the model neuron and of stuttering striatal and cortical (layer 2/3 and 5) FS cells in response to fluctuating versus steady input. Current input with varying degree of fluctuations was generated as follows. We used the FS model neuron to simulate somatic, subthreshold membrane potential fluctuations in response to random synaptic input ($f_{AMPA} = 760$, $f_{GABA} = 560$ Hz, firing rate was ~11 Hz). To avoid the influence of any suprathreshold activity, the model neuron was prevented from firing by removing the active sodium conductance. The resulting membrane potential was used as a measure of the synaptic input fluctuations, and a current proportional to the membrane potential was used for subsequent somatic injection (the time course of the fastest fluctuations in the resulting trace matched therefore the membrane time constant of the model neuron, which was ~8 ms). The scaling of the current was chosen such that the firing rate in the model (now with sodium conductance) matched the synaptically driven case. In most cases, generated current traces induced the same spikes as the synaptic input had done originally (not shown). This indicates that somatic current injection was able to mimic to a high degree the synaptic input of dendritic origin in the FS model. Next, we determined the amount of steady current injection that resulted in the same firing rate as in the case of synaptic

input (10–12 Hz). We denote this input by $q_{DC} = 1$ (fraction of steady current equal to unity, no synaptic input). Conversely, we denote the current trace that was entirely derived from the synaptic activation by $q_{DC} = 0$ (fraction of steady current equal to zero). To control the amount of input fluctuations, we varied the level of steady input, q_{DC}, between zero and one. The firing rate of the model neuron was held constant by reducing the synaptic AMPA and GABA conductances accordingly.

2.6 *IN VIVO* RECORDINGS

Samples (>12 min duration) of awake *in vivo* rat FS spike trains were taken from a previously described data set (Berke et al., 2004; Berke, 2008). Interspike intervals (ISIs) smaller than 1.5 ms (<0.8%) were excluded from the analysis.

2.7 DATA ANALYSIS

Correlation analysis

Sub- and suprathreshold synchronization and spike train similarity was measured by Pearson's correlation coefficient

$$C(t) = \frac{\sum_{i=1}^{n} x_i y_{i+t}}{\sqrt{\sum_{i=1}^{n} x_i^2 \sum_{i=1}^{n} y_i^2}}, \tag{4}$$

where t denotes the time lag between the two zero-mean vectors of data samples, x_i and y_i ($i = 1, \ldots, n+t$). For a time lag $t = 0$ and for identical vectors x_i and y_i, the correlation, $C(0)$, is equal to unity. Since we were interested in millisecond synchronization, the bin size for the suprathreshold activity was 1 or 2 ms. Synchronization was either shown as a function of time lag or reported as a single number, the latter referring to the correlation value at time lag zero.

Measurement of stuttering onset

The time of stuttering onset was measured as the time of the first spike peak in the first stuttering episode for each model neuron. The onset time difference for a pair of FS neurons was defined as the absolute value of the time difference of stuttering onset in the two neurons. To avoid stimulus-driven correlation in the stuttering discharge of two neurons, the begin of step current input was randomly shifted by ±25 ms for each cell.

Measurement of the phase lag of the subthreshold oscillations

The phase lag of the subthreshold oscillations between two FS model neurons was defined as the phase difference for frequencies 40–48 Hz, i.e., for frequencies for which the power spectrum showed a peak (see **Figure A5** in Appendix). The phase difference was mapped from $0 - 2\pi$ (0–360°) to $0 - \pi$ by mirroring the phase angles in the polar coordinate system along the horizontal axis. This is equivalent to using the absolute value if the phase difference would have been defined in the range $\pm\pi$.

Measurement of spike clustering

For the analysis of clustered spikes in the model and *in vitro*, we used the minimal interspike interval, ISI_{min}, for each individual trace and considered two spikes to be member of the same spike group if their ISI was less than 2 ISI_{min}. To exclude the possibility that ISI_{min} was affected by ISI outliers, which were sometimes observed for

short, strong depolarizations in the case of fluctuating input, ISI_{min} was obtained by using the second percentile of the ISIs. However, the results did not depend on this particular choice, i.e., similar results were obtained when using the smallest ISI or the first percentile. ISI_{min} varied between individual FS neurons and was also dependent on the stimulus strength; for the striatal FS cells it was 14.7 ± 8.8 ms (mean $\pm$ SD, average over various input scalings, $n = 450$ traces). The shortest ISI for each cell was 3–5 ms (second percentile). Clusters were defined as groups with 3 or more spikes. For the simulated traces in the stuttering and the tonically firing FS model neuron, we also used the coefficient of variation of the ISI, CV_{ISI}, as an indicator for spike clustering (see **Figures A2 and A3** in Appendix).

Spike shuffling

For an *in vivo* spike train with mean firing frequency, *f*, we obtained shuffled, Poisson-distributed ISIs from an exponential distribution with rate parameter $\lambda = 1/f$, and uniformly distributed ISIs from a continuous uniform distribution on the interval $(0, 2/f)$. To account for the refractory period, random numbers were discarded and repeatedly drawn if an ISI was shorter than 1.5 ms. The resulting spike trains had the same spike rate, *f*, as the original *in vivo* trace.

Statistical analysis

Values are expressed as mean $\pm$ SD if not noted otherwise. For the regression analysis between sub- and suprathreshold activity we used the *F*-test, for the multiple comparison between control and electrical coupling the one-way ANOVA test (significance level 0.01), and for comparison of the mean percentage of clustered spikes the unequal variance *t*-test. Data was analyzed in MATLAB (Mathworks, MA, USA) and R[1] and visualized with GNUPLOT[2].

3 RESULTS

3.1 STUTTERING DISCHARGE REQUIRES STEADY DEPOLARIZATION

Many fast-spiking (FS) interneurons show random stuttering in response to somatic current steps (**Figure 1B**). However, the response to such an artificial step current can only reveal specific features of the electrophysiological signature of neuronal cells (see, e.g., Mainen and Sejnowski, 1995). Two hallmarks of the stuttering in FS interneurons are the clustered spiking and the stochastic nature of firing discharge (Englitz et al., 2008). To study if these features contribute to FS firing under more physiological conditions, we investigated the influence of input fluctuations on the spike activity in FS interneurons. This was first done in a morphologically extended version of the one-compartment model by Golomb et al. (2007), which allowed the conductance-based modeling of proximal and distal synaptic input (**Table 1**).
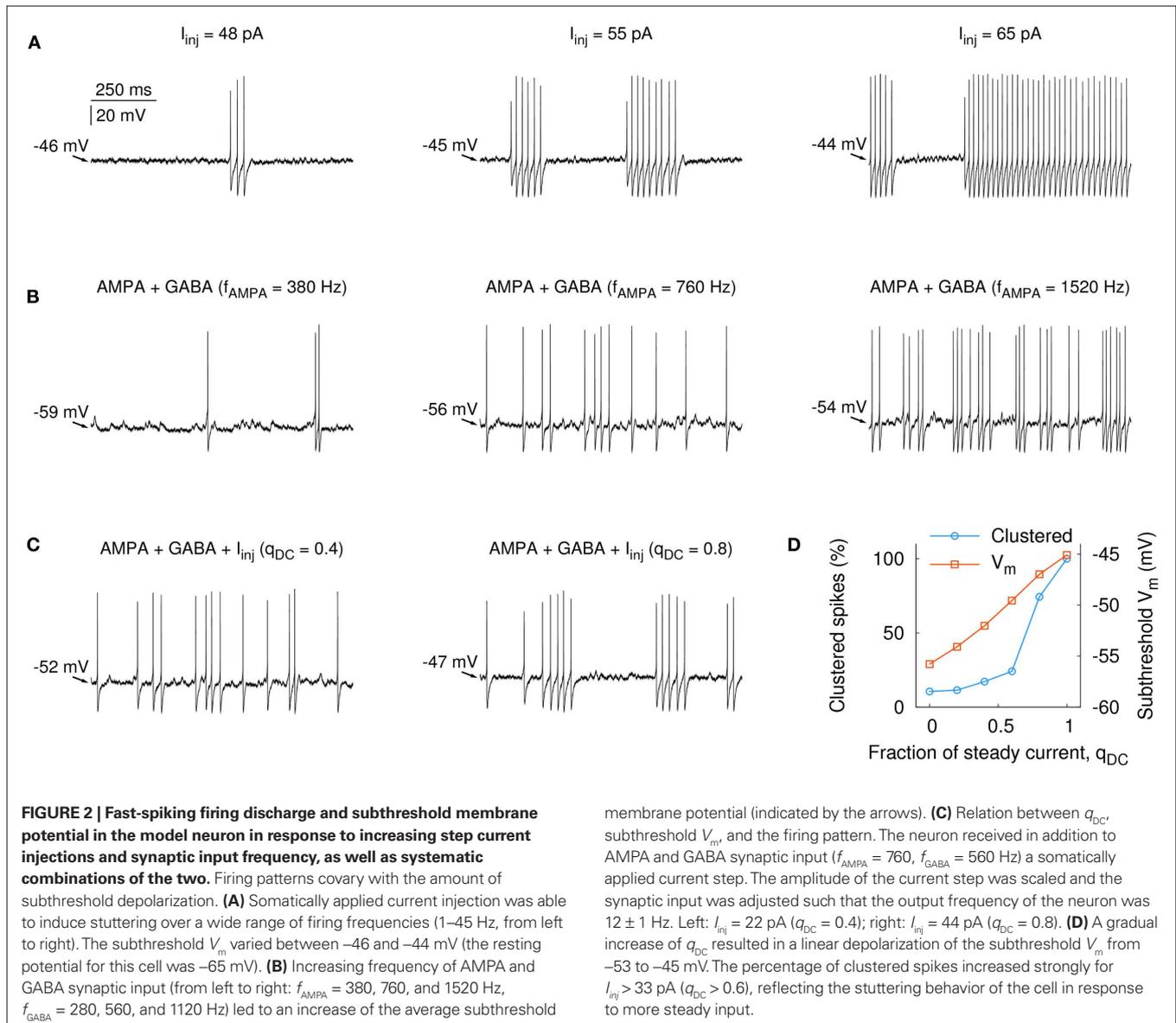
In the FS model, stuttering in response to somatic step currents could be observed over a wide range of firing frequencies, where both the spike rate and the average length of the stuttering episodes increased with larger input amplitudes (**Figure 2A**, firing rates ranged from 1 to 45 Hz from left to right). The amplitude of the somatic current step also had an influence on the subthreshold membrane potential, V_m. In the model, V_m was about -46 mV when

the first spikes were elicited (i.e., 19 mV above the resting potential, left panel in **Figure 2A**) and depolarized by an additional 2 mV at firing rates > 40 Hz (**Figure 2A**, right panel). When the FS model was activated by synaptic AMPA input, the spike discharge was characterized by many single spikes and spike doublets, without showing the characteristic stuttering behavior (**Figure 2B**, increasing synaptic input frequency from left to right). Interestingly, even though V_m depolarized with increasing input frequency, it remained far below -46 mV, which was the subthreshold membrane potential above which stuttering was readily observed for step current injections (**Figure 2A**). At a firing rate of 25 Hz, for example, the subthreshold V_m was -54 mV (**Figure 2B**, right panel). To study the effect of the input type on the subthreshold depolarization and on the stuttering discharge in more detail, we systematically varied the fraction of steady input, q_{DC}. For each level of q_{DC}, the firing rate of the FS model was held constant by simultaneously reducing the synaptic conductances (see Section 2). Thus, larger values of q_{DC} resulted in smaller input fluctuations at the same FS spike rate. **Figure 2C** shows the responses of the FS model for two levels of q_{DC}. To obtain the same firing rate (~12 Hz) for $q_{DC} = 0.4$ and 0.8, the synaptic conductances were reduced to 50 and 14% compared to $q_{DC} = 0$, respectively. The synaptic input train in **Figure 2C** is the same as in the middle trace of **Figure 2B** ($f_{AMPA} = 760, f_{GABA} = 560$ Hz, only synaptic amplitudes were reduced). This can be seen in the spike signature, which is hardly affected by the reduction of the synaptic conductances at $q_{DC} = 0.4$, despite the fact that the subthreshold V_m depolarized from -56 mV (synaptic input only, $q_{DC} = 0$) to -52 mV ($q_{DC} = 0.4$). At $q_{DC} = 0.8$, however, the spike signature changed to more stuttering-like firing ($V_m = -47$ mV, right panel in **Figure 2C**). In summary, increasing levels of q_{DC} led to a linear depolarization of the subthreshold V_m and an abrupt (non-linear) change from more regular firing to stuttering discharge at the same firing rate (**Figure 2D**).

The opening of synaptic channels decreases the input resistance of a neuron. Was the smaller amount of subthreshold depolarization a result of the synaptic activation alone (the GABA synapses had a reversal potential of -60 mV), or was it also attributable to the input fluctuations? To answer this question, we created traces of fluctuating current that resembled somatic potential fluctuations in the case of synaptic input. The current traces were derived from the model for different amounts of q_{DC} (see Section 2). This allowed us to study the response of the model neuron by an entirely current-driven approach, that is, without the activation of synaptic conductances. Furthermore, the current traces enabled us to measure the response of striatal FS interneurons to changing levels of input fluctuations in whole-cell patch-clamp recordings *in vitro*. The traces in **Figure 3A** show the resulting discharge for the model and a striatal FS cell for different levels of steady input, q_{DC}. As for the case with synaptic conductances (**Figures 2C,D**), V_m increased in a linear manner, and with decreasing input fluctuations the firing pattern changed from regular spiking to stuttering discharge with a high percentage of clustered spikes (**Figures 3B,C**; black traces: $n = 5$ striatal neurons, firing rate ranged from 2.2 to 64 Hz; red trace: model neuron). The mean percentage of clustered spikes was significantly different between fluctuating and steady input (4.7 and 82.9%, respectively; $p = 0.0002$, $n = 5$ striatal FS neurons, unequal variance *t*-test, right panel in **Figure 3C**). These

FIGURE 2 | Fast-spiking firing discharge and subthreshold membrane potential in the model neuron in response to increasing step current injections and synaptic input frequency, as well as systematic combinations of the two. Firing patterns covary with the amount of subthreshold depolarization. **(A)** Somatically applied current injection was able to induce stuttering over a wide range of firing frequencies (1–45 Hz, from left to right). The subthreshold V_m varied between –46 and –44 mV (the resting potential for this cell was –65 mV). **(B)** Increasing frequency of AMPA and GABA synaptic input (from left to right: f_{AMPA} = 380, 760, and 1520 Hz, f_{GABA} = 280, 560, and 1120 Hz) led to an increase of the average subthreshold

membrane potential (indicated by the arrows). **(C)** Relation between q_{DC}, subthreshold V_m, and the firing pattern. The neuron received in addition to AMPA and GABA synaptic input (f_{AMPA} = 760, f_{GABA} = 560 Hz) a somatically applied current step. The amplitude of the current step was scaled and the synaptic input was adjusted such that the output frequency of the neuron was 12 ± 1 Hz. Left: I_{inj} = 22 pA (q_{DC} = 0.4); right: I_{inj} = 44 pA (q_{DC} = 0.8). **(D)** A gradual increase of q_{DC} resulted in a linear depolarization of the subthreshold V_m from –53 to –45 mV. The percentage of clustered spikes increased strongly for I_{inj} > 33 pA (q_{DC} > 0.6), reflecting the stuttering behavior of the cell in response to more steady input.

results indicate that steady input leads to a more depolarized subthreshold membrane potential and induces stuttering discharge in FS interneurons (compare **Figures A2 and A3** in Appendix for a tonically firing FS model).

Importantly, the responses to steady input (q_{DC} = 1) in the model and *in vitro* showed a large variability between trials, whereas spike trains in response to fluctuating input (q_{DC} = 0) were more repeatable from trial to trial (cf. Mainen and Sejnowski, 1995). For striatal FS neurons, this can be seen in the elevated trial-to-trial correlation for q_{DC} = 0 compared to q_{DC} = 1 (**Figure 3D**, $p < 10^{-5}$, n = 4 cells, unequal variance t-test, bin size 2 ms). The trial-to-trial correlation at q_{DC} = 1 was not significantly different from zero (p = 0.92, one-sample t-test) as was the trial-to-trial correlation for shuffled traces (random permutation of 2 ms bins, not shown). Taken together, these results show that the amount of input fluctuations strongly influences the firing pattern and the spike time reliability in striatal FS interneurons.

3.2 SPIKE SYNCHRONY IN ELECTRICALLY COUPLED FS INTERNEURONS

Fast-spiking interneurons in the striatum are coupled by gap junctions (Kita et al., 1990; Galarreta and Hestrin, 2001; Fukuda, 2009) and electrical connections between these neurons have been confirmed *in vitro* (Koós and Tepper, 1999). In cortical FS cells, such electrical coupling contributes to synchronized spiking (Gibson et al., 2005; Mancilla et al., 2007). However, in awake, behaving animals, neighboring FS cells in the striatum do not show any sign of broadly synchronized firing (Berke, 2008). The lack of spike synchrony among striatal FS cells *in vivo* might give an indication of the input regime in which these cells operate, i.e., fluctuating versus steady input (Hjorth et al., 2009). We therefore used the stuttering FS model neuron to explore how the amount of input fluctuations influences the spike synchronization in a pair of electrically connected cells.

In the model, electrical coupling through gap junctions had a strong ability to synchronize periods of stuttering activity in neurons that received steady current input. **Figure 4A** shows an
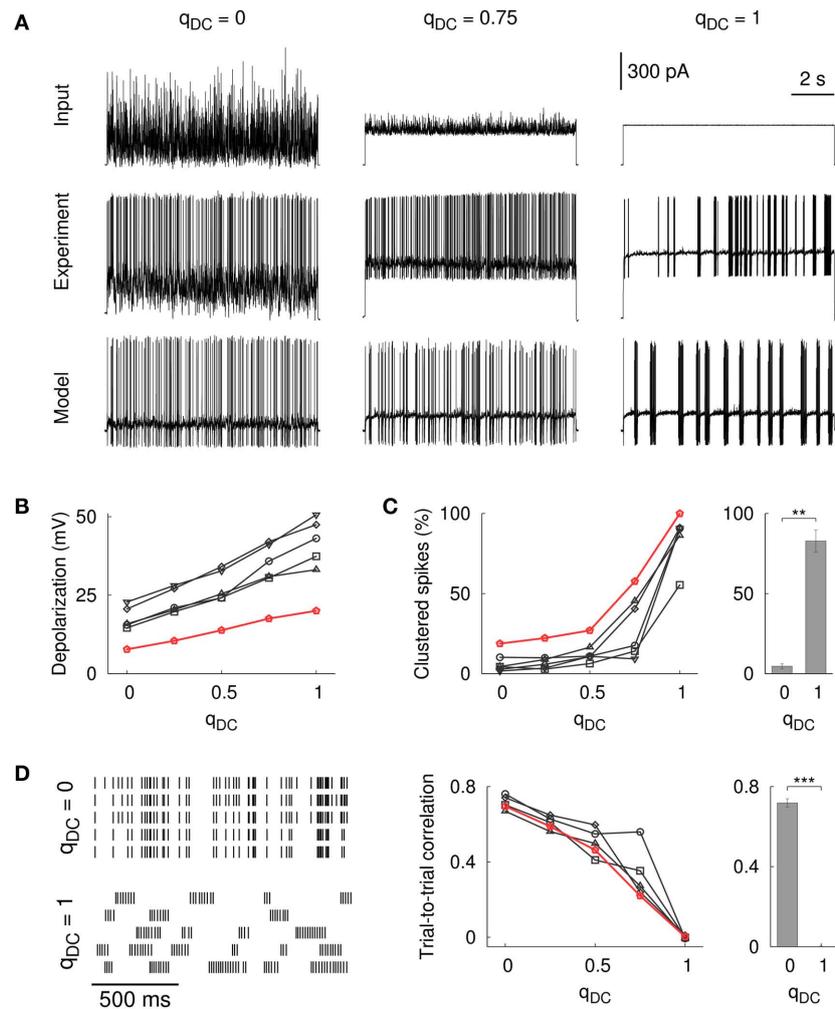
FIGURE 3 | Influence of input fluctuations on FS firing patterns in the model and *in vitro*. (A) The spike pattern of the model neuron and of a striatal FS neuron following a somatically applied current injection with varying degree of fluctuations. Responses are shown for q_{DC} = 0, 0.75, and 1.0 (from left to right). The scale bars for the voltage traces correspond to 30 mV. The scale bar for the current traces corresponds to the *in vitro* experiment. **(B)** Depolarization of the subthreshold membrane potential (measured from the resting baseline). The membrane potential depolarized continuously as the input fluctuations diminish, that is, with increasing levels of steady input (black lines: n = 5 striatal FS neurons, red line: model cell). Two random input traces and different scalings were tested (450 traces in total, firing rate ranged from 2.2 to 64.4 Hz, the average firing rate was 18.9 ± 11.5 Hz). **(C)** Steady current input resulted in

stuttering seen as an increase in the percentage of clustered spikes. The number of clustered spikes was significantly different between fluctuating and steady input [n = 5 striatal FS cells, $t(4.4)$ = –11.0, p = 0.0002, unequal variance t-test]. **(D)** Left: example rastergram for a striatal FS neuron that repeatedly receives the same input (5 trials). Spike trains were more reliable for FS cells that were not in the stuttering regime (q_{DC} = 0). Variability was high for stuttering cells (q_{DC} = 1) resulting in zero trial-to-trial correlation [$t(3)$ = 0.11, p = 0.92, one-sample t-test]. Middle: trial-to-trial correlation as a function of q_{DC} (black lines: n = 5 striatal FS neurons, red line: model cell). Right: The difference between q_{DC} = 0 and q_{DC} = 1 was statistically significant [n = 5 striatal FS neurons, $t(3.2)$ = 34.7, $p < 10^{-4}$, unequal variance t-test]. The bin size for the spike detection was 2 ms.

example of two unconnected FS neurons (upper traces) and the same pair of cells electrically coupled at the distal part of the primary dendrites (lower traces, ~11% steady-state coupling). Although the cross-correlation, which measures the spike synchronization between the two neurons, decreased substantially with increasing distance between the location of the gap junctions and the soma (**Figure 4B**), the time difference of stuttering onset in both cells was in the majority of cell pairs smaller than 50 ms for proximal coupling (i.e., soma and primary dendrites, **Figure 4C**). In the model, proximal electrical coupling was also

able to synchronize subthreshold oscillations in the connected FS neurons, although this effect was not very strong (**Figures A4 and A5** in Appendix). Importantly, the fast entrainment of spiking activity in two connected neurons did not require a small phase lag between the preceding subthreshold oscillations, which is apparent in the missing correlation between the phase lag of the subthreshold oscillations and the time difference of the stuttering onset in both cells (**Figure 4C**). Furthermore, proximal coupling via gap junctions did not significantly change the number of spikes per burst but it resulted in a delayed stuttering discharge after stimulus

onset (**Figure 4D**). The reason for this firing delay, which was only seen for proximal coupling, is most likely the shunting of charge across the gap junctions.

   In the case of steady current injection, a small number of spikes in one FS neuron was sufficient to induce a stuttering episode in an electrically connected cell (**Figures 4A,C**). We next analyzed the spike synchronization in two electrically connected FS cells over a wide range of input fluctuations, i.e., from $q_{DC} = 0$ to 1 (**Figure 4E**). The voltage traces in **Figure 4F** show an example of two cells that were not in the stuttering regime. The neurons received a small amount of somatic current input ($q_{DC} = 0.4$) and in addition AMPA and GABA synaptic input. Although gap junctions at the primary dendrites were able to induce and suppress single APs in connected neurons (**Figure 4F**, arrows), spike synchronization as measured by the cross-correlation between FS 1 and FS 2 was low (**Figure 4E**). With increasing levels of q_{DC}, FS firing tended to be more clustered and more variable (increasing CV_{ISI}, upper panel in **Figure 4E**, see also **Figure A2** in Appendix), and spike correlation between the two connected cells increased (lower panel in **Figure 4E**). To test if this spike synchronization required steady input in both FS model neurons, we repeated the simulation with one of the FS cells, FS 1, being permanently in the stuttering regime, and by varying q_{DC} for FS 2 only (**Figures 4G,H**). **Figure 4H** shows an example of two model cells that receive different levels of q_{DC} as it can be seen in the different levels of V_m and different firing patterns in the two cells. While the stuttering cell, FS 1, showed strong changes in the spike signature (i.e., low values of spike time reliability) as a result of electrical coupling, the neighboring neuron, FS 2, showed a high spike time reliability when driven by fluctuating input (**Figure 4G**, lower panel), thus, resulting in little spike synchronization among the two cells (**Figure 4G**, upper panel). Therefore, stuttering in a single FS model neuron was not sufficient to broadly induce synchronized spikes in electrically connected neighbor cells. These

results and the lack of spike synchrony *in vivo* (Berke, 2008) suggest that in awake, behaving animals, striatal FS cells are not in the stuttering regime simultaneously.

3.3 FS FIRING PATTERNS INFLUENCE THE DISTRIBUTION OF POSTSYNAPTIC POTENTIALS IN MEDIUM SPINY NEURONS

The discharge of striatal FS neurons in awake, behaving animals is characterized by large fluctuations of the instantaneous firing rate with numerous high-frequency bursts, single spikes, and periods of silence (Berke et al., 2004; Berke, 2008). Given the strong depressive component in the dynamics of striatal FS-to-MS synapses (Plenz and Kitai, 1998; Koós et al., 2004; Gittis et al., 2010; Planert et al., 2010), differences in the firing patterns of FS interneurons might affect the influence on the postsynaptic MS cells (cf. Abbott et al., 1997). We used the firing patterns of three FS neurons from the prior *in vivo* studies by Berke et al. (2004) and Berke (2008), and simulated the resulting train of synaptic potentials in postsynaptic MS neurons. The measurement of the FS-to-MS synaptic parameters was done *in vitro* (Planert et al., 2010). **Figure 5A** shows an example of the averaged postsynaptic MS response to a train of presynaptic FS spikes *in vitro* (8 spikes plus one test pulse). From these averaged responses we extracted the PSPs and used their amplitude values for the parameter fitting in the FS-to-MS model synapse (see Section 2). The model synapse was able to replicate the PSP amplitudes for different FS firing frequencies (**Figure A1** in Appendix). **Figure 5B** shows the normalized PSP amplitude for a typical FS-to-MS synapse as a function of spike number for different ISIs (1.5–20 ms). A fully recovered synapse responded with a sequence of decreasing PSP amplitudes to the first few spikes independent of input frequency. Differences in the PSP amplitudes and their steady-state values became, however, evident for larger numbers of APs. Lower spike frequencies allowed more synaptic recovery between the arrival of spikes, resulting in larger steady-state amplitudes (compare, e.g., ISI = 6 and 20 ms in
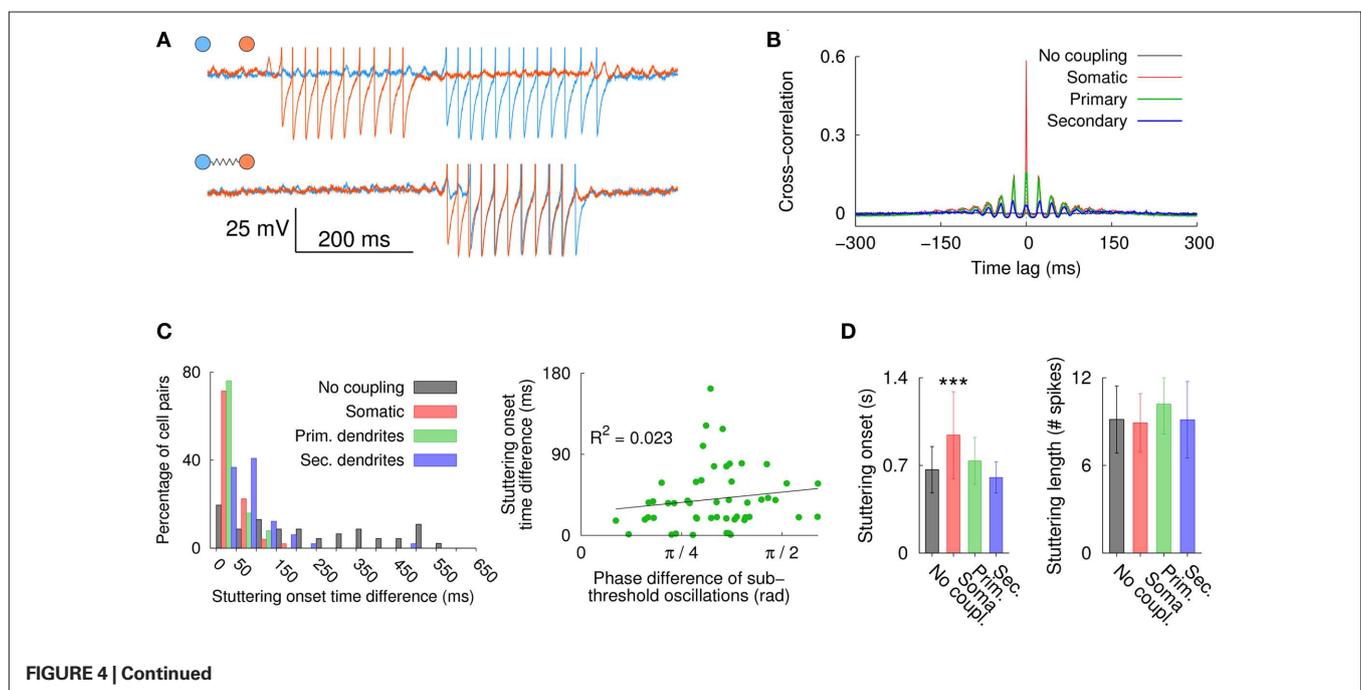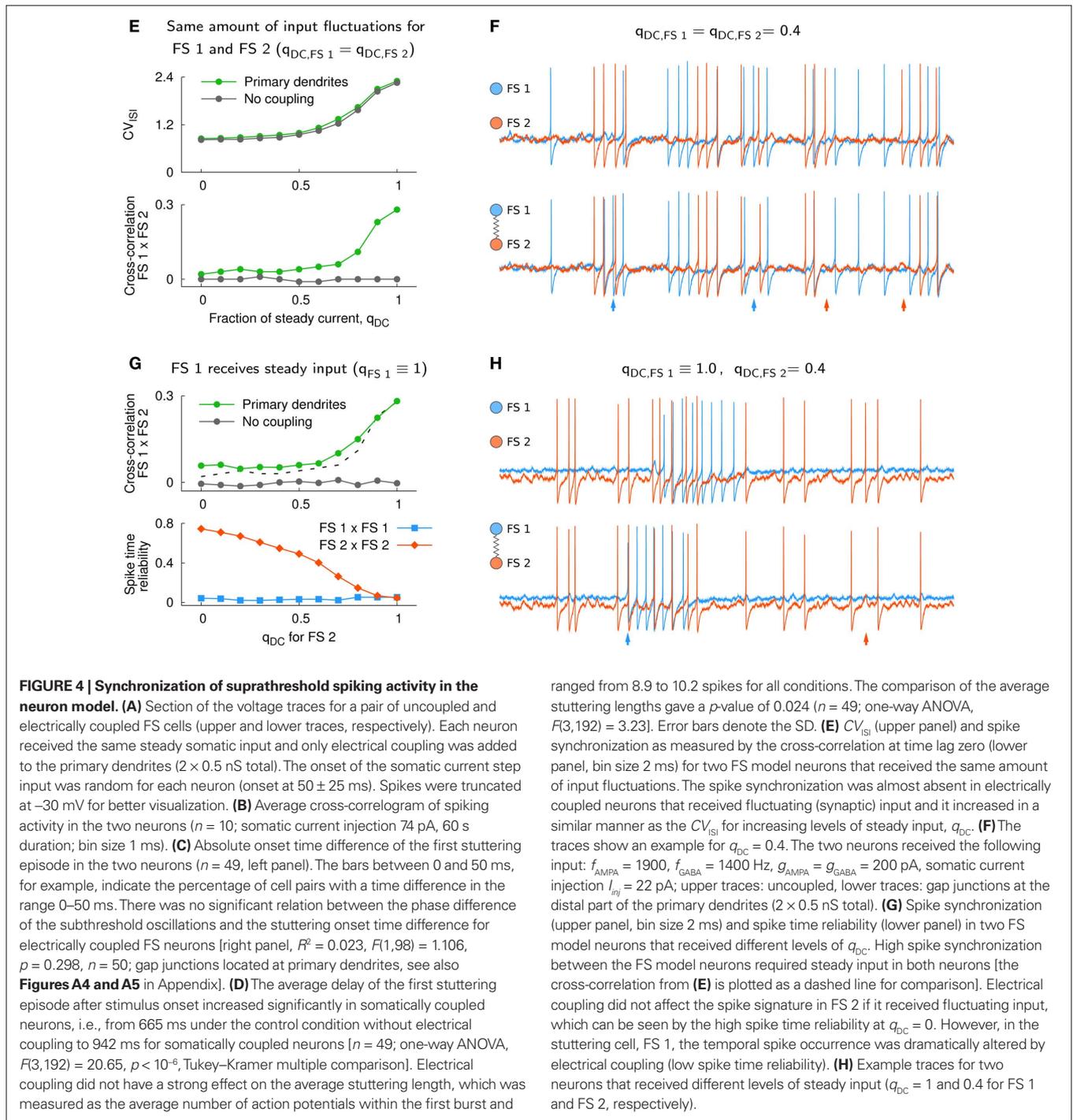

FIGURE 4 | Continued

FIGURE 4 | Synchronization of suprathreshold spiking activity in the neuron model. (A) Section of the voltage traces for a pair of uncoupled and electrically coupled FS cells (upper and lower traces, respectively). Each neuron received the same steady somatic input and only electrical coupling was added to the primary dendrites (2×0.5 nS total). The onset of the somatic current step input was random for each neuron (onset at 50 ± 25 ms). Spikes were truncated at -30 mV for better visualization. **(B)** Average cross-correlogram of spiking activity in the two neurons ($n = 10$; somatic current injection 74 pA, 60 s duration; bin size 1 ms). **(C)** Absolute onset time difference of the first stuttering episode in the two neurons ($n = 49$, left panel). The bars between 0 and 50 ms, for example, indicate the percentage of cell pairs with a time difference in the range 0–50 ms. There was no significant relation between the phase difference of the subthreshold oscillations and the stuttering onset time difference for electrically coupled FS neurons [right panel, $R^2 = 0.023$, $F(1,98) = 1.106$, $p = 0.298$, $n = 50$; gap junctions located at primary dendrites, see also **Figures A4 and A5** in Appendix]. **(D)** The average delay of the first stuttering episode after stimulus onset increased significantly in somatically coupled neurons, i.e., from 665 ms under the control condition without electrical coupling to 942 ms for somatically coupled neurons [$n = 49$; one-way ANOVA, $F(3,192) = 20.65$, $p < 10^{-6}$, Tukey–Kramer multiple comparison]. Electrical coupling did not have a strong effect on the average stuttering length, which was measured as the average number of action potentials within the first burst and

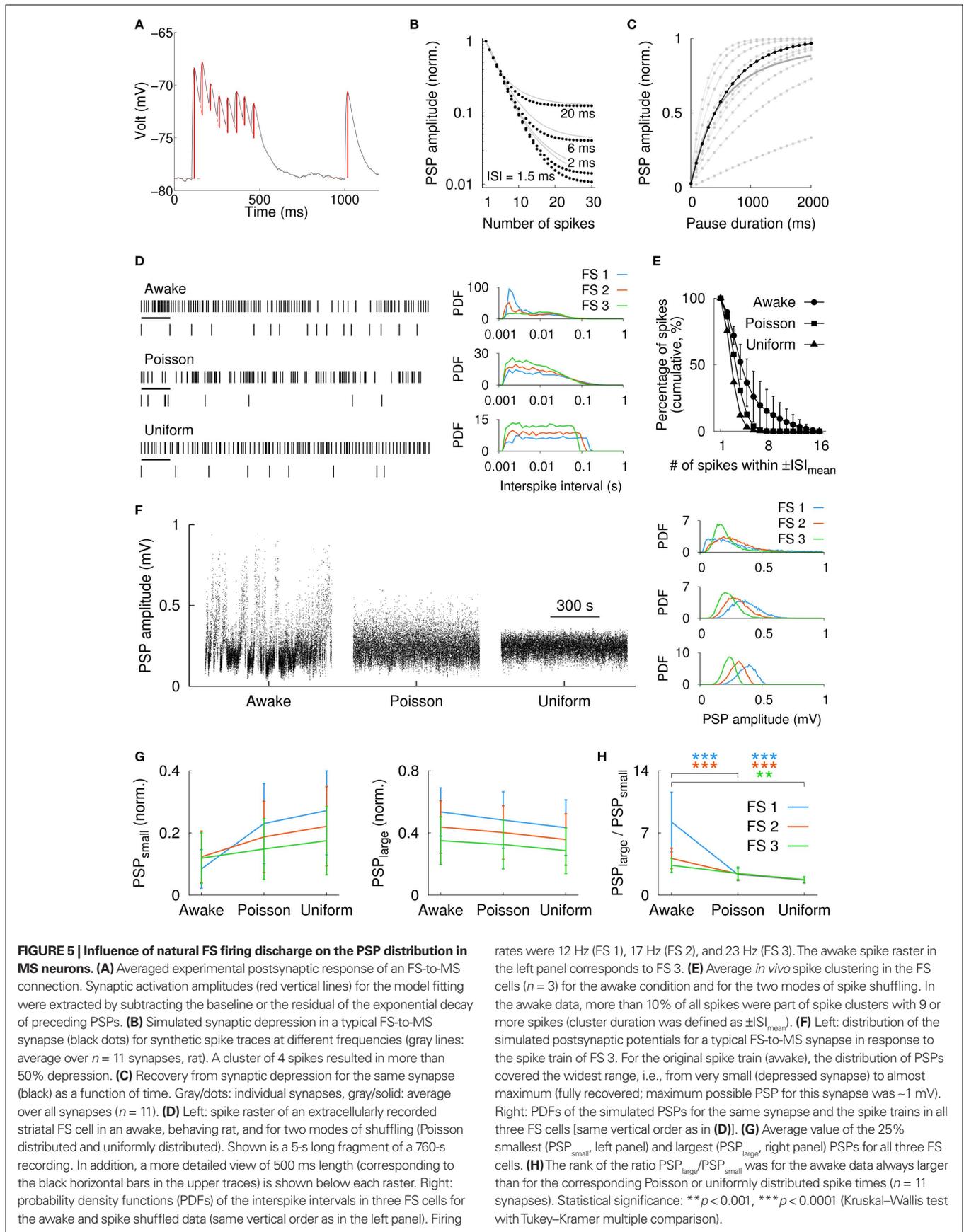ranged from 8.9 to 10.2 spikes for all conditions. The comparison of the average stuttering lengths gave a p-value of 0.024 ($n = 49$; one-way ANOVA, $F(3,192) = 3.23$]. Error bars denote the SD. **(E)** CV_{ISI} (upper panel) and spike synchronization as measured by the cross-correlation at time lag zero (lower panel, bin size 2 ms) for two FS model neurons that received the same amount of input fluctuations. The spike synchronization was almost absent in electrically coupled neurons that received fluctuating (synaptic) input and it increased in a similar manner as the CV_{ISI} for increasing levels of steady input, q_{DC}. **(F)** The traces show an example for $q_{DC} = 0.4$. The two neurons received the following input: $f_{AMPA} = 1900$, $f_{GABA} = 1400$ Hz, $g_{AMPA} = g_{GABA} = 200$ pA, somatic current injection $I_{inj} = 22$ pA; upper traces: uncoupled, lower traces: gap junctions at the distal part of the primary dendrites (2×0.5 nS total). **(G)** Spike synchronization (upper panel, bin size 2 ms) and spike time reliability (lower panel) in two FS model neurons that received different levels of q_{DC}. High spike synchronization between the FS model neurons required steady input in both neurons [the cross-correlation from **(E)** is plotted as a dashed line for comparison]. Electrical coupling did not affect the spike signature in FS 2 if it received fluctuating input, which can be seen by the high spike time reliability at $q_{DC} = 0$. However, in the stuttering cell, FS 1, the temporal spike occurrence was dramatically altered by electrical coupling (low spike time reliability). **(H)** Example traces for two neurons that received different levels of steady input ($q_{DC} = 1$ and 0.4 for FS 1 and FS 2, respectively).

Figure 5B). Full recovery of the synaptic resources required longer firing pauses. **Figure 5C** shows the normalized values of recovered PSP amplitudes as a function of pause duration, which is measured from the end of a preceding spike train that caused a steady-state depression of the synapse (same synapse as in **Figure 5B**, in black). The time course for the synaptic recovery, τ_P ranged from 230 ms to almost 5 s (1.03 ± 1.34 s, $n = 11$ synapses from rat). Thus, depressing FS-to-MS synapses particularly emphasize the onset of FS firing after prolonged pauses. Taken together, these results suggest that differences in the FS firing pattern have an influence on the amount of synaptic depression and/or recovery and therefore on PSP amplitudes. We determined the distribution of PSP amplitudes in the FS-to-MS synapse model in response to FS firing patterns that were recorded *in vivo* and compared it to PSP distributions that resulted from random, shuffled spike activity.

The upper rastergram in **Figure 5D** shows a 5-s long section and a 500-ms detail (black bar) from an extracellular *in vivo* recording in a freely moving rat ("awake"). This "awake" spike activity was

FIGURE 5 | Influence of natural FS firing discharge on the PSP distribution in MS neurons. (A) Averaged experimental postsynaptic response of an FS-to-MS connection. Synaptic activation amplitudes (red vertical lines) for the model fitting were extracted by subtracting the baseline or the residual of the exponential decay of preceding PSPs. **(B)** Simulated synaptic depression in a typical FS-to-MS synapse (black dots) for synthetic spike traces at different frequencies (gray lines: average over $n = 11$ synapses, rat). A cluster of 4 spikes resulted in more than 50% depression. **(C)** Recovery from synaptic depression for the same synapse (black) as a function of time. Gray/dots: individual synapses, gray/solid: average over all synapses ($n = 11$). **(D)** Left: spike raster of an extracellularly recorded striatal FS cell in an awake, behaving rat, and for two modes of shuffling (Poisson distributed and uniformly distributed). Shown is a 5-s long fragment of a 760-s recording. In addition, a more detailed view of 500 ms length (corresponding to the black horizontal bars in the upper traces) is shown below each raster. Right: probability density functions (PDFs) of the interspike intervals in three FS cells for the awake and spike shuffled data (same vertical order as in the left panel). Firing

rates were 12 Hz (FS 1), 17 Hz (FS 2), and 23 Hz (FS 3). The awake spike raster in the left panel corresponds to FS 3. **(E)** Average *in vivo* spike clustering in the FS cells ($n = 3$) for the awake condition and for the two modes of spike shuffling. In the awake data, more than 10% of all spikes were part of spike clusters with 9 or more spikes (cluster duration was defined as $\pm ISI_{mean}$). **(F)** Left: distribution of the simulated postsynaptic potentials for a typical FS-to-MS synapse in response to the spike train of FS 3. For the original spike train (awake), the distribution of PSPs covered the widest range, i.e., from very small (depressed synapse) to almost maximum (fully recovered; maximum possible PSP for this synapse was ~1 mV). Right: PDFs of the simulated PSPs for the same synapse and the spike trains in all three FS cells [same vertical order as in **(D)**]. **(G)** Average value of the 25% smallest (PSP_{small}, left panel) and largest (PSP_{large}, right panel) PSPs for all three FS cells. **(H)** The rank of the ratio PSP_{large}/PSP_{small} was for the awake data always larger than for the corresponding Poisson or uniformly distributed spike times ($n = 11$ synapses). Statistical significance: **$p < 0.001$, ***$p < 0.0001$ (Kruskal–Wallis test with Tukey–Kramer multiple comparison).

used to derive Poisson distributed and uniformly distributed spike rasters with the same average spike rate. **Figure 5D** (right panel) shows the ISI distributions in three FS cells for the *in vivo* and the corresponding shuffled spike trains. The graph in **Figure 5E** visualizes the clustering of spikes; it shows the percentage of spikes that contain at least a given number of APs within a period of $\pm ISI_{mean}$ ms around each spike. Here, we analyzed the clustering in terms of the mean interspike interval, ISI_{mean}, which was more comparable to the time constant of synaptic depression than ISI_{min} was (see above). ISI_{mean} ranged from 43 to 82 ms for the three neurons. In the awake spike train, more than 10% of the spikes were organized in groups of at least nine spikes (**Figure 5E**). For Poisson and uniformly shuffled spike trains, the percentage of spikes that were member of large spike clusters was comparatively smaller (**Figure 5E**). High-frequency clusters and intermittent firing pauses in the *in vivo* spike train furthermore resulted in a wide range of simulated PSP amplitudes. **Figure 5F** shows the PSP amplitude distribution for the model of a typical FS-to-MS synapse for *in vivo* as well as Poisson and uniformly shuffled spike activity (from left to right). The PSP distributions for the *in vivo* input and the shuffled data for this synapse are shown in the right panels of **Figure 5F** for the three FS cells (same vertical order as in **Figure 5D**). The relative large number of extended spike cluster in the awake data, as it can be seen in **Figure 5E**, resulted in a reduction of the small PSP amplitudes as shown in **Figure 5G** for all three FS cells (left panel, $n = 11$ synapses). Here, PSP_{small} was defined as the average normalized amplitude of the 25% smallest PSPs. Importantly, pauses in the awake FS activity allowed also for the recovery of synaptic amplitudes as evident from the average normalized amplitude of the 25% largest PSPs, PSP_{large}, which was largest for the awake data (**Figure 5G**, right panel). Consequently, the ratio PSP_{large}/PSP_{small} was largest for the awake spike train, and shuffling of the data as described above destroyed the structure of the *in vivo* firing and resulted in a smaller range of observed PSP amplitudes (**Figure 5H**). Therefore, these results suggest that FS-to-MS synapses utilize a large fraction of their possible amplitude spectrum in response to *in vivo*-like input, i.e., from strongly depressed to entirely recovered.

4 DISCUSSION

4.1 MODELING OF FS FIRING

Fast-spiking interneurons can be characterized electrophysiologically by their firing discharge in response to somatic current steps (Markram et al., 2004; Taverna et al., 2007). Based on the model of a cortical FS neuron, it was suggested that the size of the Na$^+$ window current influences minimal firing rate and firing patterns (Golomb et al., 2007). In the present study, we used a morphologically extended version of the FS model by Golomb et al. (2007) with a small Na$^+$ window current, which together with "intrinsic" (white) noise induced the characteristic stuttering behavior and subthreshold oscillations observed in many FS cells of the cortex and the striatum. Indeed, although the precise origin of the stuttering discharge is not known, intrinsic stochastic mechanisms are the most likely source for the irregular bursting in these cells (Englitz et al., 2008).

The FS model parameters in the present study were not additionally adjusted to match the FS cell properties recorded *in vitro*. Consequently, the FS model showed some differences compared to

the *in vitro* measurements, that is, the model had a stronger afterhyperpolarization (Golomb et al., 2007) and a longer minimal ISI. While the strong afterhyperpolarization was not a critical issue for the present study, the larger ISI in the model cell (~10 ms compared to less than 4 ms *in vitro* and *in vivo*) prevented the use of simulated spike trains for the depressing synapse model because synaptic depression was strongly dependent on the ISI. However, instead of adjusting the model parameters in order to achieve a shorter minimal ISI, we used spike trains from striatal FS interneurons recorded *in vivo* (Berke et al., 2004; Berke, 2008) for the simulation of the postsynaptic FS-to-MS response. Importantly, despite the above differences, the model captured and predicted key features of striatal and cortical FS interneurons *in vitro* (**Figure 3** and **Figure A6** in Appendix, respectively). For increasing levels of steady input, both the model and *in vitro* measurements showed: (i) a linear rise of the subthreshold V_m, (ii) a non-linear onset of stuttering discharge, and (iii) an increase of the trial-to-trial variability. Therefore, the broad agreement between the model and the measurements *in vitro* provides strong support for the validity of the results from the simulation of electrically coupled FS cells (see below).

4.2 FS FIRING AND THE INFLUENCE OF STEADY AND FLUCTUATING INPUT

In the present study, we investigated the influence of steady and fluctuating input on FS firing. As shown previously, steady input resulted in random stuttering activity in the model (Golomb et al., 2007) as well as *in vitro* (Kawaguchi, 1993; Markram et al., 2004), while the response to fluctuating (synaptic) input was characterized by reliable spiking (Mainen and Sejnowski, 1995; Schneidman et al., 1998) without showing the characteristic stuttering discharge (La Camera et al., 2006). The profound difference in the spike reliability for different input was also reflected in the amount of spike synchronization among electrically coupled FS cells in the model. Although the steady-state coupling in electrically connected FS neurons is not sufficient to induce APs in neighboring FS cells in the striatum (Koós and Tepper, 1999) and in the model, our simulations indicate that spikes are easily synchronized when the neurons receive suprathreshold, steady input. This finding is consistent with previous reports from *in vitro* and modeling studies in the striatum (Tepper et al., 2004; Hjorth et al., 2009) and the cortex (Galarreta and Hestrin, 1999; Nomura et al., 2003; Mancilla et al., 2007; Zahid and Skinner, 2009). In contrast, spike synchronization was drastically reduced when the FS cells received fluctuating input (see Hjorth et al., 2009, who showed a similar behavior in a model of tonically firing FS cells).

In our experiments, additional (steady) depolarization was achieved by somatic current injection. In the striatum, similar effects might result from the excitatory effects of various neuromodulators, such as serotonin (Blomeley and Bracci, 2009), acetylcholine (Koós and Tepper, 2002), and dopamine (Bracci et al., 2002) – many of them showing task-related regulation (see, e.g., Hyland et al., 2002). Membrane depolarization can also be induced by the metabotropic glutamate receptor mGluR1 (Bonsi et al., 2007) or by NMDA receptor mediated currents, although a recent study reports a lack of NMDA receptor mediated synaptic currents (Gittis et al., 2010). Thus, whether the reported amounts of depolarization occur *in vivo* and if they would be sufficient for

FS neurons to enter the stuttering regime at least transiently is not known. Our modeling results for a pair of electrically connected FS cells and the lack of evident spike synchronization *in vivo* (Berke, 2008) rather suggest that in awake, behaving animals neighboring FS interneurons are not in the stuttering regime simultaneously. Therefore, the FS firing variability *in vivo* with short periods of high firing (reminiscent of stuttering) is likely to represent temporally precise activity, which is driven by the fluctuations in the input (Softky and Koch, 1993; van Vreeswijk and Sompolinsky, 1996). Importantly, inhibitory connections between striatal FS neurons can not fully explain the lack of *in vivo* spike synchronization since only about half of the pairs of FS cells are connected (Gittis et al., 2010). It should be noted, however, that although gap junction coupling between striatal FS interneurons has been demonstrated in electrophysiological recordings *in vitro* (Tepper et al., 2004) and immunohistochemical stainings (Fukuda, 2009), another possible explanation for the absence of spike synchronization might be the lack of functional electrical coupling *in vivo*. Indeed, gap junctions have been shown to be regulated by various factors (Harris, 2001; Urschel et al., 2006; Gonzlez-Nieto et al., 2008) and *in vivo* patch-clamp recordings, in which subthreshold activity can be recorded, would allow the investigation of this question directly.

4.3 FS FIRING VARIABILITY IS TRANSLATED INTO VARIABILITY OF POSTSYNAPTIC RESPONSES IN MS PROJECTION NEURONS

Fast-spiking interneurons of the striatum form symmetrical synapses on MS projection neurons. Similar to cortical FS to principal neuron connections (Galarreta and Hestrin, 1998), these synapses show depressing dynamics *in vitro* (Plenz and Kitai, 1998; Gittis et al., 2010; Planert et al., 2010). The *in vivo* FS discharge in behaving rats is characterized by numerous large clusters of high-frequency spikes, which resulted in strong depression in the synapse model. Importantly, pauses in the FS firing allowed for the recovery of synaptic resources. Together this suggests that striatal FS-to-MS synapses might operate over a wide range of PSP amplitudes in which the depressive nature of the synapses contributes to the variability of PSP sizes. However, if synaptic depression in FS-to-MS connections is dominating the synaptic dynamics also *in vivo* is currently not known. In fact, recent evidence from cortical neurons suggests that synaptic depression observed *in vitro* can be diminished by ongoing activity *in vivo* (Reig et al., 2006; Reig and Sanchez-Vives, 2007). Nevertheless, the impact of FS synapses on postsynaptic MS neurons also depends on the timing of the PSPs, which directly reflects the firing variability observed in FS cells. Striatal FS neurons receive

excitatory afferents from cortex and thalamus, and inhibitory input along the pallidostriatal pathway and from intrastriatal sources (as well as various modulatory projections, see above; Wilson, 2004). These inputs are most likely the main source for the observed firing variability in the FS cells.

Striatal FS neurons have been shown to prevent or delay spiking in postsynaptic MS cells (Koós and Tepper, 1999). However, our results indicate that FS cells *in vivo* communicate via substantially depressed synapses over extended periods of time. The summative effect of several converging FS cells (Tepper et al., 2004) as well as temporal summation might compensate for the depletion in individual synapses. In order to study the combined effect of all presynaptic FS cells onto a single MS neuron, knowledge about the spike times in the presynaptic FS population would be required. Similarly, to predict how postsynaptic currents (which are proportional to our PSPs in the current-clamp measurements) influence an MS neuron *in vivo* requires knowledge about the membrane potential of the MS cell, since these neurons are known to show strong inward rectification (Kawaguchi, 1993). These points were not addressed in this study and could be a question for future research.

5 CONCLUSION

Our results indicate that FS firing variability observed *in vivo* is most likely due to the input that these neurons receive, and that this variability is translated into variability of the postsynaptic responses in MS projection neurons. The fact that the FS-to-MS synapse model showed substantial depression over extended periods of time in response to natural FS firing patterns might indicate the importance of cooperative effects of multiple presynaptic FS interneurons and the precise orchestration of their activity in shaping the activity of the MS projection neuron.

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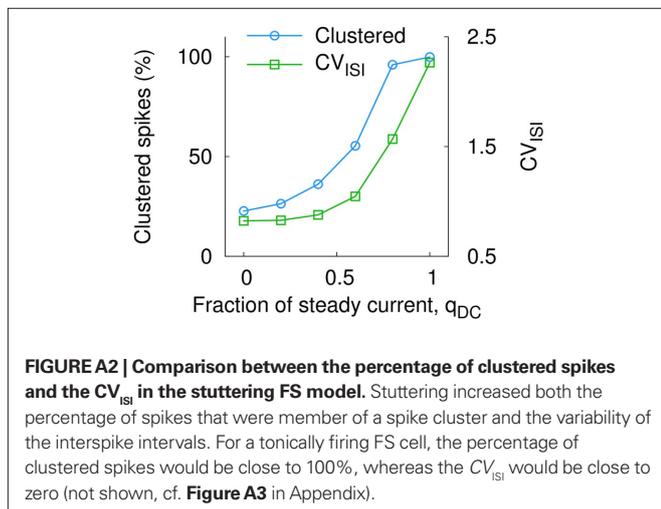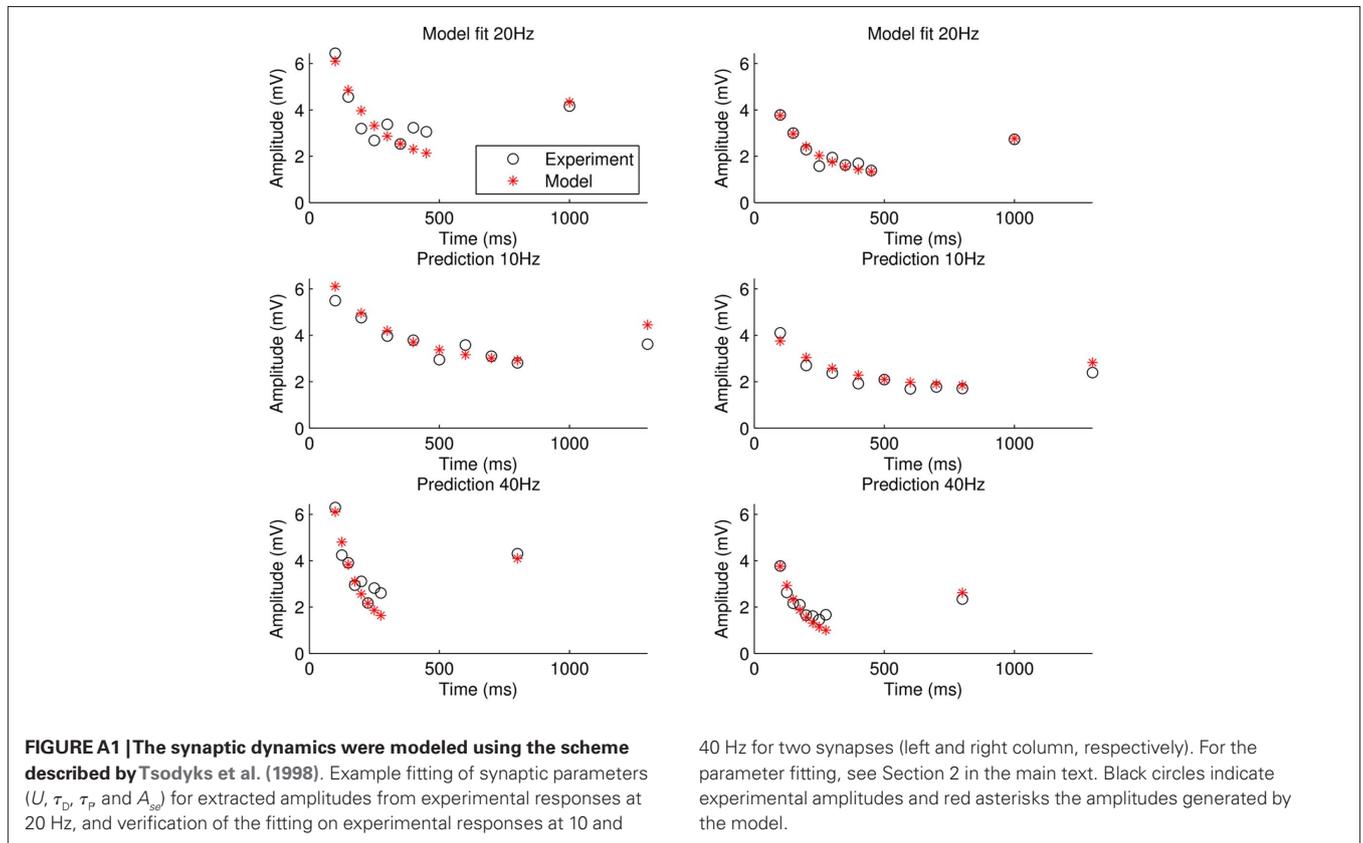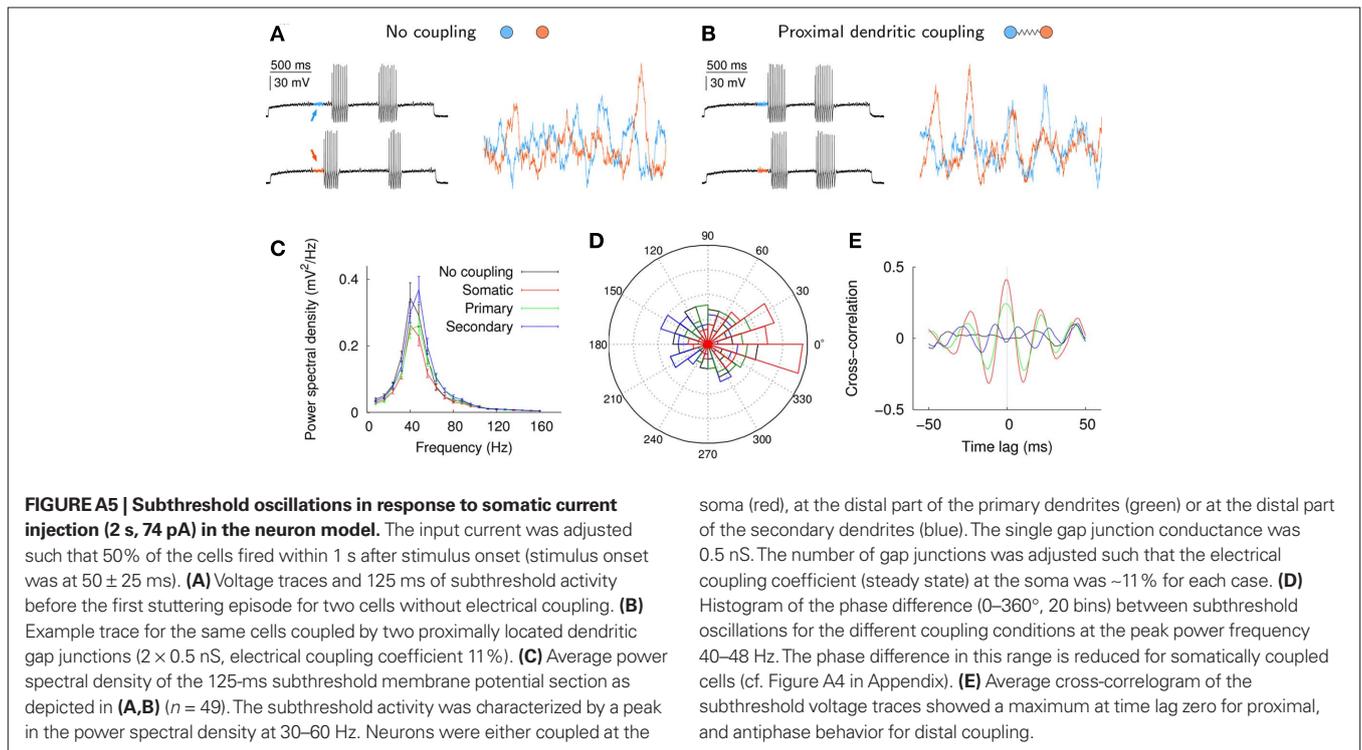
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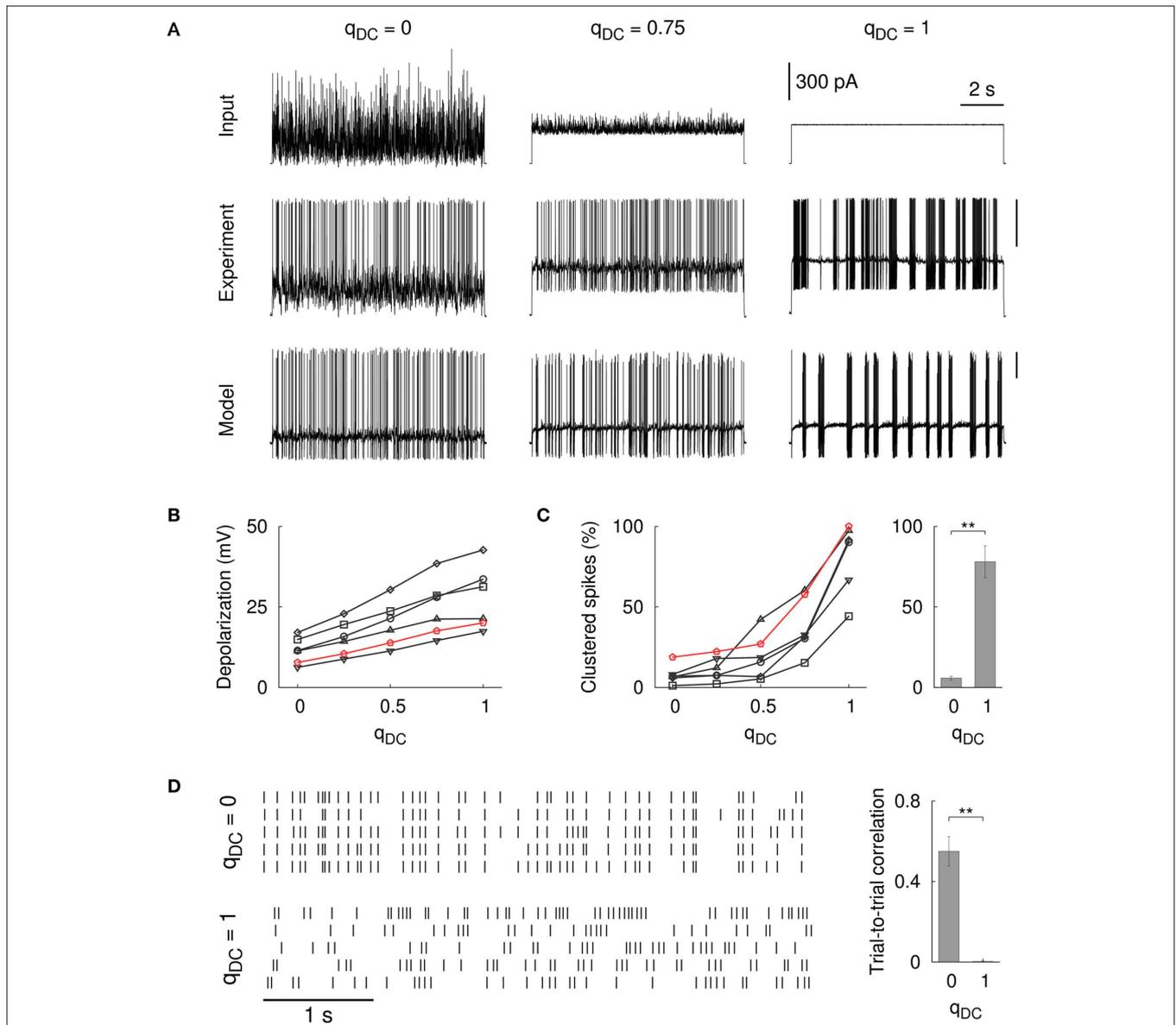
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Conflict of Interest Statement: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

APPENDIX

FIGURE A1 | The synaptic dynamics were modeled using the scheme described by Tsodyks et al. (1998). Example fitting of synaptic parameters (U, τ_D, τ_P and A_{se}) for extracted amplitudes from experimental responses at 20 Hz, and verification of the fitting on experimental responses at 10 and 40 Hz for two synapses (left and right column, respectively). For the parameter fitting, see Section 2 in the main text. Black circles indicate experimental amplitudes and red asterisks the amplitudes generated by the model.

FIGURE A2 | Comparison between the percentage of clustered spikes and the CV_{ISI} in the stuttering FS model. Stuttering increased both the percentage of spikes that were member of a spike cluster and the variability of the interspike intervals. For a tonically firing FS cell, the percentage of clustered spikes would be close to 100%, whereas the CV_{ISI} would be close to zero (not shown, cf. **Figure A3** in Appendix).

FIGURE A3 | Steady input increased the firing variability in the stuttering FS model as can be seen in an increase of the CV_{ISI}. In an FS model neuron that showed tonic discharge, as opposed to stuttering, the firing variability diminished as the fraction of steady input, q_{DC}, increased. Two responses are shown for each neuron. For the stuttering cell, we used for the sodium current a half-maximum potential of $\theta_m = -22$ mV and for the conductance of the d-type current $g_{KD} = 1.6$ mS/cm² (see Section 2, main text). The parameters for the model neuron that produced tonic discharge were $\theta_m = -28$ mV and $g_{KD} = 0.39$ mS/cm² (Golomb et al., 2007).

FIGURE A4 | The distribution, mean value and SD of the phase differences in the subthreshold activity of two FS neurons ($n = 49$ trials) as a function of frequency. The phase difference was mapped from $0 - 2\pi$ ($0 - 360°$) to $0 - \pi$ by mirroring the vectors of phase angles along the horizontal axis. A randomly distributed phase angle would have a mean of $\pi/2$. Proximal coupling resulted in smaller values of the phase difference at low frequencies. Note the large variation even for the case of somatic coupling. The steady state coupling coefficient for the connected neurons was ~11% (see Section 2, main text).

FIGURE A5 | Subthreshold oscillations in response to somatic current injection (2 s, 74 pA) in the neuron model. The input current was adjusted such that 50% of the cells fired within 1 s after stimulus onset (stimulus onset was at 50 ± 25 ms). **(A)** Voltage traces and 125 ms of subthreshold activity before the first stuttering episode for two cells without electrical coupling. **(B)** Example trace for the same cells coupled by two proximally located dendritic gap junctions (2 × 0.5 nS, electrical coupling coefficient 11%). **(C)** Average power spectral density of the 125-ms subthreshold membrane potential section as depicted in **(A,B)** ($n = 49$). The subthreshold activity was characterized by a peak in the power spectral density at 30–60 Hz. Neurons were either coupled at the soma (red), at the distal part of the primary dendrites (green) or at the distal part of the secondary dendrites (blue). The single gap junction conductance was 0.5 nS. The number of gap junctions was adjusted such that the electrical coupling coefficient (steady state) at the soma was ~11% for each case. **(D)** Histogram of the phase difference (0–360°, 20 bins) between subthreshold oscillations for the different coupling conditions at the peak power frequency 40–48 Hz. The phase difference in this range is reduced for somatically coupled cells (cf. Figure A4 in Appendix). **(E)** Average cross-correlogram of the subthreshold voltage traces showed a maximum at time lag zero for proximal, and antiphase behavior for distal coupling.

FIGURE A6 | Influence of input fluctuations in cortical FS interneurons. (A) The spike pattern of the model neuron and of a cortical FS cell for $q_{DC} = 0$, 0.75, and 1.0 (left to right; scale bar for voltage traces, 30 mV). **(B)** Depolarization of the subthreshold membrane potential (measured from the resting baseline). Black lines: $n = 5$ cortical FS neurons, red line: model cell. Two random input traces and different scalings were tested (81 traces in total, 10 s each). Firing rate was 15.8 ± 7.6 Hz and ranged from 2.5 to 31 Hz. **(C)** Steady current input resulted in stuttering seen as an increase in the percentage of clustered spikes. The number of clustered spikes was significantly different between fluctuating and steady input [$n = 5$ cortical FS cells, $t(4.1) = -7.2$, $p = 0.0017$, unequal variance t-test]. **(D)** Trial-to-trial variability of spiking was low in cortical FS

neurons that were driven by fluctuating input ($q_{DC} = 0$, spike rasters in the left panel are shown for one FS cell). In contrast, a high variability was observed in response to steady input ($q_{DC} = 1$, spike rasters for the same neuron). The difference of the trial-to-trial correlation between $q_{DC} = 0$ and $q_{DC} = 1$ was statistically significant [right panel, $n = 4$ cortical FS neurons, $t(4.0) = 7.5$, $p = 0.0017$, unequal variance t-test]. The trial-to-trial correlation for the stuttering neurons was not different from zero [$n = 4$ cells, $t(2) = 0.92$, $p = 0.45$, one-sample t-test]. Five trials (10 s each) were tested per condition and neuron. It should be noted that one cortical FS cell was recorded with a low intracellular chloride concentration (8 mM). All other neurons were recorded with the same intracellular concentrations as for the striatal FS neurons (**Figure 3,** main text).