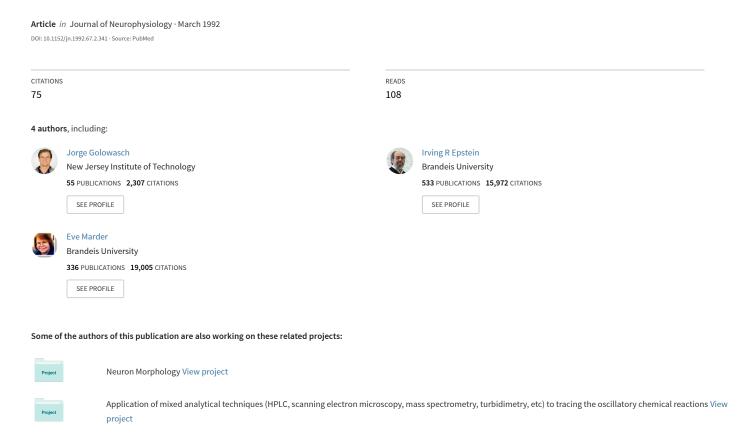
# Contribution of individual ionic currents to activity of a model stomatogastric ganglion neuron



## Contribution of Individual Ionic Currents to Activity of a Model Stomatogastric Ganglion Neuron

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#### SUMMARY AND CONCLUSIONS

1. The behavior of the mathematical model for the lateral pyloric (LP) neuron of the crustacean stomatogastric ganglion (STG) developed in the previous paper was further studied.

2. The action of proctolin, a neuromodulatory peptide that acts directly on the LP neuron, was modeled. The effect of the proctolin-activated current  $(i_{proc})$  on the model neuron mimics the effects of proctolin on the isolated biological LP neuron. The depolarization and increased frequency of firing seen when  $i_{proc}$  is activated are associated with changes in the relative contributions of the delayed rectifier  $(i_d)$  and the  $Ca^{2+}$ -activated outward current  $(i_{o(Ca)})$  to the repolarization phase of the action potential. 3. The effects of turning off the A-current  $(i_A)$  in the model

were compared with those obtained by pharmacologically blocking  $i_A$  in the biological neuron.  $i_A$  appears to regulate action-potential frequency as well as postinhibitory rebound activity.

4. The role of  $i_A$  on the rhythmic activity of the cell was studied by modifying several of its parameters while periodically activating a simulated synaptically activated conductance,  $i_{syn}$ 

5. The effects of manipulations of the maximal conductances  $(\bar{g})$  for  $i_{\rm d}$  and  $i_{\rm o(Ca)}$  were studied.  $i_{\rm d}$  strongly influences action-potential frequency, whereas  $i_{\rm o(Ca)}$  strongly influences action-potential duration.

6. Modifications of the maximal conductance of the inward  $\operatorname{Ca}^{2+}$  current  $(i_{\operatorname{Ca}})$  were compared with the effects of blocking  $i_{\operatorname{Ca}}$ in the real cell.

7. The role of the hyperpolarization-activated inward current  $(i_h)$  during ongoing rhythmic activity was assessed by periodically activating  $i_{syn}$  while modifying  $i_h$ .

#### INTRODUCTION

One of the major motivations behind the construction of conductance-based neuronal models is to obtain and develop insights into the role that specific conductances play in controlling the excitability and firing properties of a neuron. Because models, unlike living cells, give the investigator direct access to information concerning all the currents simultaneously as the membrane potential varies with time, they allow us to see directly the relative values of multiple currents in a way not possible with electrophysiological recordings. In this paper we study the model developed in the previous paper (Buchholtz et al. 1992) by perturbing it in different ways: current injection, modifying parameters, and turning currents on or off. On the one hand, we use these perturbations to compare the model's behavior with that shown by the real neuron. On the other hand, we use the perturbed model to understand better the role that the major time- and voltage-dependent conductances play in shaping the behavior of the lateral pyloric (LP) neuron.

#### METHODS

The model employed in these studies is that developed in the preceding paper (Buchholtz et al. 1992). We shall refer to the model with the parameters in Table 1 of that paper as the standard model. The behavior of the cell is governed by the equation

$$c_{\mathfrak{m}} \cdot dV/dt = i_{\mathsf{ext}} - \sum_{j \mid i_j}$$
 (1)

where  $c_{\rm m}$  is the membrane capacitance of the cell, V is the membrane potential,  $i_{ext}$  is the applied current, and  $\sum_{i}$  is the sum over the seven currents described by Buchholtz et al. (1992), plus the

two additional currents described below.

Current-clamp experiments are simulated simply by fixing  $i_{ext}$ at the appropriate value. Application of tetrodotoxin (TTX) is simulated by turning off the sodium current,  $i_{Na}$  (i.e.,  $\bar{g}_{Na} = 0 \mu S$ ); application of 4-aminopyridine (4-AP) is simulated by turning off the A-current,  $i_A$  (i.e.,  $\bar{g}_A = 0 \mu S$ ). In addition to the currents previously described, two other currents were added to the model for this paper. The first, the proctolin-activated current,  $i_{proc}$ , is described in the RESULTS. However, in some experiments,  $i_{proc}$  was turned on in such a way as to mimic a transient pressure application of proctolin. The diffusion of a square pulse of pressure-applied proctolin solution was simulated by making the maximal proctolin conductance  $\bar{g}_p$  proportional to the difference of two exponential functions, one representing the input pulse, the other the removal of the peptide

$$\bar{g}_{p} = (0.1 \ \mu S) \cdot f \tag{2}$$

where the proctolin activation function f is given by

$$f = 1.25 \left[ e^{-0.4(t)} - e^{-2.0(t)} \right]$$
 (3)

and t is the time in seconds.

A second added current  $(i_{syn})$  was used in some experiments to simulate inhibitory postsynaptic potentials (IPSPs) that the LP neuron routinely receives. Consistent with the treatment of Getting (1989), postsynaptic potentials were modeled with

$$i_{\text{syn}} = \bar{g}_{\text{syn}} \cdot a_{\text{syn}}(t) \cdot (V - E_{\text{K}}) \tag{4}$$

$$a_{\text{syn}}(t) = \sum_{i} a_{i}(t) \tag{5}$$

$$da_{i}/dt = \exp(-k_{1} \cdot [t - j\Delta t]) - k_{2} \cdot a_{i}$$
 (6)

where  $\bar{g}_{syn} = 0.15 \mu S$ ,  $E_K = -80 \text{ mV}$ ,  $k_1 = 50 \text{ s}^{-1}$ ,  $k_2 = 20 \text{ s}^{-1}$ , and  $\Delta t = 20 \text{ ms}$ . Equation 5 describes the temporal summation of each synaptic potential  $a_j$ , and j runs from 0 to 10 in our case. Figure 1 illustrates the time course and amplitude changes of the activation parameter  $a_{\text{syn}}$  (Eq. 5) during a simulated burst of synaptic potentials, showing the temporal summation and the slow time course of the envelope that characterizes the IPSPs that the real LP neuron receives (Eisen and Marder 1982; Hartline and Gassie 1979; Marder 1984; Fig. 2A in Golowasch and Marder 1992a).

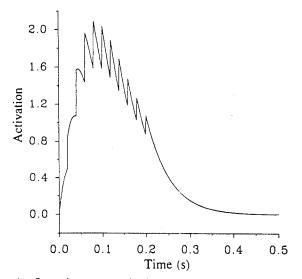


FIG. 1. Synaptic current activation.  $a_{syn}(t)$  (Eqs. 5 and 6) during 1 burst of simulated presynaptic activity. Activation values higher than 1 are obtained because of temporal summation that occurs at the presynaptic frequency used.

Physiological experiments on LP neurons shown in this paper were carried out as described in Golowasch and Marder (1992a).

#### RESULTS

#### Biophysical analysis

One of the most instructive aspects of a model of this type is the ability one gains to dissociate the cell's activity pattern into its component parts, current by current. Figure 2 shows the activity of the model cell with all the currents of the standard model (Buchholtz et al. 1992) maximally activated. The top panel corresponds to the membrane potential and shows the tonic firing of overshooting action potentials, the form of which resembles that of those recorded from the cell body of the LP cell (Fig. 5 in Buchholtz et al. 1992), except that in the real cell they are attenuated by the filtering imposed by the cable formed by the neurite's membrane between the spike initiation zone and the soma. A frequency of 8.5 Hz and a baseline of -48 mV are observed.

The middle five panels of Fig. 2 show the contribution of the currents that are playing a role during tonic activity ( $i_h$  is not shown because at these membrane potentials it is virtually inactive). The largest current is  $i_{Na}$ , which dominates both the initiation and the termination of the action potentials. As in the Hodgkin and Huxley (1952) model, it is the inactivation of  $i_{Na}$  that initiates the termination of the action potential. The shoulder in the Na<sup>+</sup> current trace is the result of the very fast change in driving force as V rapidly approaches  $E_{Na}$ . Because the inactivation of this current is slow compared with its activation, as the outward currents begin activating, thus forcing the cell to hyperpolarize, the driving force increases again before the current completely inactivates, giving rise to the secondary increase of inward current.

During tonic activity (Fig. 2) the Ca<sup>2+</sup>-activated outward current,  $i_{o(Ca)}$ , turns on faster than the delayed rectifier,  $i_d$ , so that  $i_{o(Ca)}$  contributes at least as much outward current as  $i_d$  to action-potential termination (see below). In the first

phase,  $i_{\rm o(Ca)}$  is the dominant current, whereas  $i_{\rm d}$  dominates most of the second phase of the action-potential repolarization (Fig. 2, 3rd and 4th panels). Under these conditions,  $i_{\rm A}$  turns on rather slowly and is quite small, and provides only a minor contribution to the waveform of the action potential, although it does influence firing frequency (see below).  $i_{\rm Ca}$  contributes a small inward current to the pacemaker potential and the intracellular Ca<sup>2+</sup> concentration [Ca] increase (Fig. 2, bottom panel) necessary to activate  $i_{\rm o(Ca)}$ , which in turn is the primary source of outward current for the early repolarizing phase. Finally, the leak current,  $i_{\rm l}$ , (not shown) passively and instantaneously follows the voltage changes and thus is a perfect reflection of V.

### Proctolin-activated current, iproc

Proctolin is a neuropeptide found in identified inputs to the stomatogastric ganglion (STG) (Nusbaum and Marder

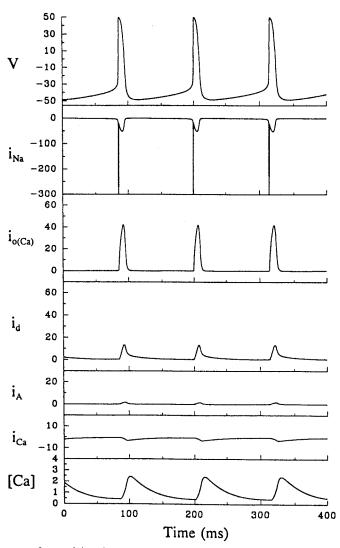


FIG. 2. Activity of the model cell and contributing conductances. Integration of Eq. 1 of the standard model (Table 1 of Buchholtz et al. 1992).  $i_{\rm ext}=0$  nA. V (top panel) is in millivolts, current amplitudes (middle panels) are in nanoamperes, and Ca<sup>2+</sup> concentration (bottom panel) is in micromolar.

1989a,b). The LP neuron is a direct target for proctolin and responds to proctolin application with a small depolarization and increase in firing frequency (Marder et al. 1986; Hooper and Marder 1987; Nusbaum and Marder 1989a,b; Golowasch and Marder 1992b). Golowasch and Marder (1992b) characterized the voltage and time dependence of the current evoked by proctolin in the LP neuron and found that  $i_{\text{proc}}$  is maximal at values close to the resting potential, and that the current activates very rapidly without apparent voltage-dependent inactivation. We have thus defined  $i_{\text{proc}}$  as governed by a single activation process p, the dynamics of which are given by the standard Eqs. I-3 of Buchholtz et al. (1992) with a voltage-independent  $k_p$ . The parameters we used are as follows: maximal conductance  $\bar{g}_p = 0.09 \ \mu\text{S}$ , reversal potential  $E_p = -10 \ \text{mV}$ , rate constant  $k_p = 166 \ \text{s}^{-1}$ , half-maximal potential  $V_p = -55 \ \text{mV}$ , and step width  $s_p = -5 \ \text{mV}$  [see METHODS (Eqs. I-3) in Buchholtz et al. 1992].

In Fig. 3 we show the calculated  $i_{\rm proc}$  (Fig. 3A), illustrating the kinetics of the activation process, and the steady-state activation  $p_{\infty}(V)$  (Fig. 3B). Because  $E_{\rm p}$  is -10 mV, the decreased driving force as the voltage increases toward  $E_{\rm p}$  (where the current is fully activated) yields the inverted bell-shaped appearance that has been measured in the LP

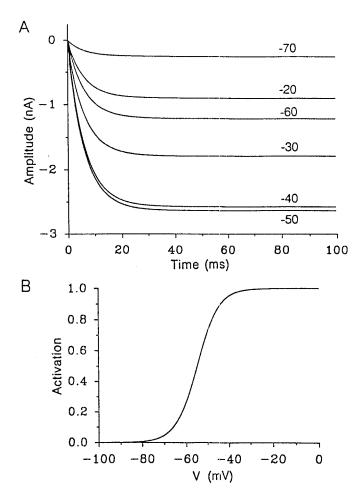


FIG. 3. Model proctolin-activated current. A: time course of the calculated  $i_{\text{proc}}$  for different voltages (indicated above the traces except for -50). B: steady-state activation  $p_{\infty}(V)$  shown as a function of membrane potential.

cell (Golowasch and Marder 1992b). Note that its amplitude is markedly voltage dependent (Fig. 3A), it activates within several milliseconds, and does not inactivate (unless proctolin is removed).

#### Simulation of pharmacological manipulations

Figure 4 compares the effect of a simulated transient pressure application of proctolin on the model neuron with the response of the real cell. Note that both the model (Fig. 4A) and the real neuron (Fig. 4B) depolarize slowly by several millivolts and start firing action potentials at a higher rate.

Figure 5 allows us to look at the individual currents and their relationship during steady activation of  $i_{proc}$ . With  $i_{proc}$ added to our standard model (Buchholtz et al. 1992), the model cell fires action potentials tonically at a frequency 19 Hz higher than control. The action potentials are slightly smaller in amplitude and ride on top of a baseline depolarized by 6 mV with respect to control (Fig. 5, Table 1). In addition to the frequency increase, the action-potential duration increases by ~10% (Table 1). Furthermore, incorporation of  $i_{proc}$  into the standard model has a surprising consequence: the relative contributions of  $i_{o(Ca)}$  and  $i_{d}$  change, the former becoming smaller and the latter becoming larger (compare the 3rd and 4th panels between Figs. 2 and 5). The drop in  $i_{o(Ca)}$  is unexpected because with proctolin the level of intracellular [Ca] is always higher, which should tend to increase the activation of  $i_{o(Ca)}$ . However, the Ca<sup>2+</sup> dependence of the inactivation of  $i_{o(Ca)}$ , which causes the conductance to decrease for high [Ca] (see Fig. 2 B of Buchholtz et al. 1992), apparently overcomes this tendency.

Simulating the effects of TTX by inactivating  $i_{\rm Na}$  in the model completely eliminates the action potentials (not shown) and leaves the cell at a resting potential of -49 mV, which compares well with the average experimental resting potential  $V_{\rm rest}$  of -48.9 mV (Golowasch and Marder 1992a).

 $i_A$  has relatively minor effects on the activity of the model cell when it is unperturbed by inputs. However, a small effect on the firing frequency might be expected from the results shown in Fig. 2 (5th panel). In fact, turning off  $i_A$ increases the frequency by  $\sim$ 14%, but with only minimal effects on the action-potential duration or the membrane potential baseline (Table 1). This effect on the firing frequency, which was sometimes observed in LP cells bathed in 4-AP to block  $i_A$ , is consistent with Fig. 3B of Buchholtz et al. (1992), which indicates that some level of  $i_A$  activation exists at these voltages.  $i_A$  has a much more significant action after the LP neuron is hyperpolarized, as shown in Fig. 6. The complicated voltage dependence of  $i_A$  suggests that, after a hyperpolarizing current pulse, the firing frequency should transiently decrease and action-potential firing should be delayed by the strong transient activation of  $i_A$ . A 1-s prepulse to about -70 mV causes the model cell to delay the firing of its first action potential by  $\sim 100$  ms and subsequently to show a firing frequency  $\sim 25\%$  slower (Fig. 6A, top) than at steady state (Fig. 2, top). When  $i_A$  is turned off, this delay is shortened significantly, and the firing frequency quickly adjusts to its steady-state value of near 8.5 Hz (Fig. 6A, bottom). This behavior was confirmed in the

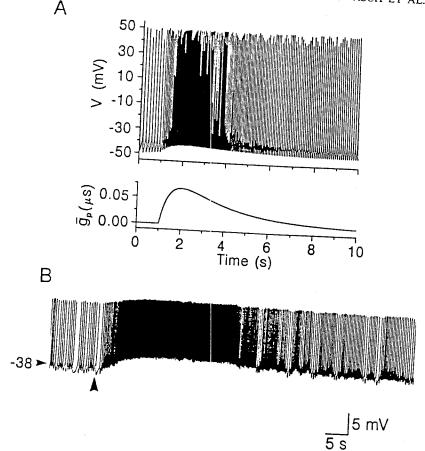


FIG. 4. Effect of a transient application of proctolin on the cell. A: model cell simulation. Standard model plus  $i_{proc}$ .  $\bar{g}_p$  follows the time-dependent changes shown in the bottom trace (Eqs. 2-4). B: LP cell's experimental response to proctolin. The stomatogastric nerve (stn) is blocked. Measured in 10  $\mu$ M PTX. Arrowhead indicates pressure application of 100  $\mu$ M proctolin (0.5 s).

real LP cell with a similar current injection protocol (Fig. 6B) in control saline (top) and in the presence of 10 mM 4-AP (bottom), which blocks  $i_A$  (Golowasch and Marder 1992a).

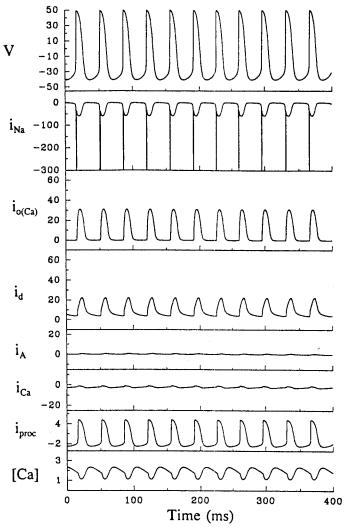
Perturbing the maximum conductances of the outward currents has characteristic effects. Figure 7 shows the effect of changes in the maximum conductance of  $i_d$  (Table 1). When  $i_d$  is turned off  $(\bar{g}_d = 0 \, \mu \text{S})$ , the model cell depolarizes to approximately +5 mV, and action potentials are abolished. Decreasing  $\bar{g}_d$  by a factor of 2  $(\bar{g}_d = 0.17 \, \mu \text{S})$  causes the baseline to depolarize by 15 mV, simultaneously increasing the firing frequency about threefold. Doubling  $\bar{g}_d$  has the opposite effect, hyperpolarizing the baseline by 9 mV and decreasing the firing frequency to  $\sim 50\%$  of the control level (Table 1). Modifications of  $i_d$  produced comparatively small changes on action-potential duration: a 20% increase was seen when  $\bar{g}_d$  was decreased, and a 12% decrease was seen when  $\bar{g}_d$  was increased twofold (Table 1). Taken together, these effects indicate that  $i_d$  has a stronger effect on the slow repolarization of the cell that contributes to firing frequency than on the spike termination.

Figure 8 shows the effect of  $i_{o(Ca)}$  on the activity of the model cell. When  $i_{o(Ca)}$  is completely inactivated  $(\bar{g}_{o(Ca)} = 0 \mu S)$ , the cell's baseline depolarizes to approximately +5 mV, and the cell stops firing action potentials, as in the case of blocking  $i_d$ . If  $\bar{g}_{o(Ca)}$  is decreased twofold  $(\bar{g}_{o(Ca)} = 1.6 \mu S)$ , the baseline remains at control levels, and the firing frequency increases only ~2%. When  $\bar{g}_{o(Ca)}$  is doubled  $(\bar{g}_{o(Ca)} = 6.4 \mu S)$ , the baseline hyperpolarizes by 4 mV, and

the firing frequency changes also by only  $\sim 2\%$ . However, the same conductance changes evoke a 17% increase and a 14% decrease, respectively, in action-potential duration (Table 1). These observations suggest that  $i_{o(Ca)}$  contributes mainly to the narrowing (termination) of the action potential and to a lesser extent to the repolarization governing firing frequency of the cell than  $i_d$  (compare Figs. 7 and 8, Table 1).

Blocking  $i_{Ca}$  causes a decrease in the frequency of tonic firing from 8.5 to 2.7 Hz, a broadening of the action potentials by  $\sim 46\%$ , and a hyperpolarization of the baseline voltage by 13 mV (Fig. 9.4, Table 1). The explanation of these effects can be found in Fig. 2, which shows that  $i_{Ca}$  contributes a small inward current to the cell that, if blocked, would cause the cell to hyperpolarize. It also contributes the necessary  $Ca^{2+}$  to activate  $i_{o(Ca)}$ . The broadening of the action potentials is the consequence of inactivating  $i_{o(Ca)}$  and is consistent with the effects recorded in the LP cell. Figure 9 B shows the effect of  $Cd^{2+}$  (which blocks both components of Ca in the real cell) on the firing activity of an isolated LP cell. Bath application of  $200~\mu M$   $Cd^{2+}$  hyperpolarizes the baseline, increases the duration of the action potentials, and increases slightly the action-potential amplitude, effects that are consistent with a blocking effect on  $i_{Ca}$  and  $i_{o(Ca)}$ . However, almost no effect on the action-potential frequency was observed (see DISCUSSION).

Because  $i_h$  activates at more hyperpolarized voltages than those the cell normally undergoes when isolated from chemical synapses, we have simulated IPSPs similar to those the



Activity of the model cell and contributing conductances during activation of  $i_{proc}$ . Integration of  $Eq.\ 1$  of the standard model plus  $i_{proc}$  (described in the text).  $V(top\ panel)$  is in millivolts, current amplitudes (middle panels) are in nanoamperes, and [Ca] (bottom panel) is in micromolar. Notice the different relative amplitudes of  $i_{\rm o(Ca)}$  and  $i_{\rm d}$  compared with Fig. 2.

LP cell receives from its synaptic neighbors (Eisen and Marder 1982; Hartline and Gassie 1979; Marder 1984; Fig. 2 in Golowasch and Marder 1992a) according to Eqs. 4-6. In Fig. 10, trains of 10 IPSPs 20 ms apart were applied at

Effects of conductance modification on the model cell

| Condition*  | Spike<br>Duration,<br>ms† | Firing<br>Frequency,<br>Hz | Baseline,<br>mV |
|---|---------------------------|----------------------------|-----------------|
| Control $(i_{proc\ OFF})$   | 12.0                      | 8.5                        | -48             |
| $\bar{g}_n = 0.09 \mu\text{S}$  | 13.2                      | 27.5                       | -42             |
| $ \begin{aligned} \bar{g}_{p} &= 0.09 \ \mu S \\ \bar{g}_{A} &= 0 \ \mu S \end{aligned} $ | 11.6                      | 9.3                        | -48             |
| $\bar{g}_{d} = 0.17 \ \mu S (\frac{1}{2} \text{ control})$                                | 14.4                      | 29.0                       | -33             |
| $\vec{g}_{d} = 0.7 \ \mu S \ (2 \times \text{control})$                                   | 10.6                      | 4.4                        | -57             |
| $\vec{g}_{o(Ca)} = 1.6 \ \mu S (\frac{1}{2} \text{ control})$                             | 14.0                      | 8.7                        | -48             |
| $\vec{g}_{\alpha(Ca)} = 6.4 \mu\text{S} (2\times \text{control})$                         | 10.3                      | 8.3                        | -52             |
| $\bar{g}_{Ca} = 0 \mu\text{S}$  | 17.5                      | 2.7                        | -61             |

<sup>=</sup>  $0 \mu S$  unless indicated. † Measured at -20 mV.

intervals of 1 s, and the effects of modifying  $i_h$  are illustrated. Inactivating  $i_h$  has no noticeable effect on the tonic firing of the model cell (not shown). Doubling  $\tilde{g}_h$  has a minor effect on the frequency of firing (compare the 1st and 3rd traces of Fig. 10). Additionally, doubling  $\bar{g}_h$  has a small but clear effect on the phase at which a new burst of action potentials begin after a train of IPSPs. A shift of +15 mV in the activation curve of  $i_h$  (i.e.,  $V_r = -55$  mV instead of -70mV) induces a much more pronounced effect both on the firing frequency and on the phase at which a new burst begins after a train of IPSPs (Fig. 10, 2nd panel). A much stronger effect is observed when both of these changes are made simultaneously (Fig. 10, 4th panel). Here a 70% increase in firing frequency and a 50% phase advance are observed. In addition to this, during the hyperpolarizing phase, the stronger  $i_h$  (Fig. 10, bottom trace) becomes activated enough to allow the cell to remain more depolarized throughout the inhibitory phase than in control conditions (Fig. 10, top trace). This effect would be expected to have a pronounced consequence on graded synaptic transmitter release (Graubard et al. 1983).

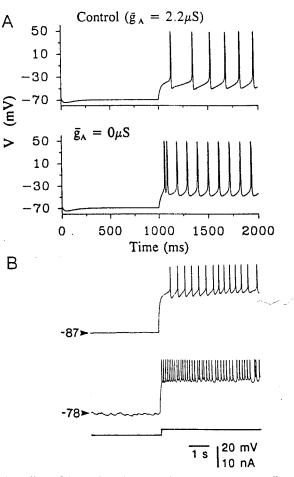


FIG. 6. Effect of  $i_A$  on the rebound activity of the cell. A: effect on model cell. Standard model;  $i_{proc}$  is turned off. At t=0 ms, a pulse of  $i_{ext}=-3$  nA is applied for 1,000 ms. Top: the control with  $i_A$  intact. Bottom: the same protocol but with  $\bar{g}_A=0$   $\mu$ S. B: effect on LP cell. Preparation PTX, with the input nerve stn blocked. The cell was hyperpolarized by -3  $\mu$ A for 1.5 c before releasing the current. Control is shown in the ten trace. nA for 15 s before releasing the current. Control is shown in the top trace and the bottom trace shows the effect after a fast and short perfusion in 10 mM 4-AP (to minimize its toxic effects).

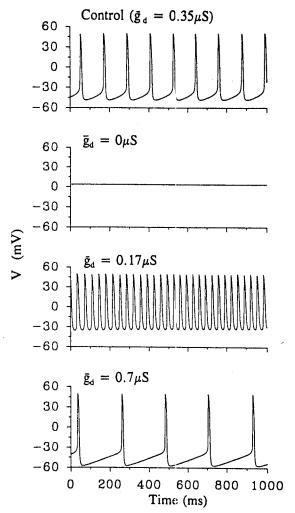


FIG. 7. Effect of modifying  $i_d$  on the activity of the model cell. Standard model with  $i_{proc}$  turned off.  $\bar{g}_d$  values for each condition are indicated on the *top left corner* of each panel. Notice the marked effect on firing frequency and baseline voltage.

The latency from the end of the train of IPSPs to the first action potential is critical for timing in the pyloric rhythm. Hartline and Gassie (1979) have suggested that neurons that recover from synaptic inhibition more slowly may have a larger  $i_A$ , or they could have an  $i_A$  with shifted activation and inactivation curves. Figure 6 shows that  $i_A$  has a strong influence on the latency to the first spike after a hyperpolarization. Figure 11 shows the effect of modifying the voltage threshold (i.e., half-maximal potential) (see Buchholtz et al. 1992) for the inactivation  $(V_B)$  and the activation  $(V_A)$  processes of  $i_A$  in the postsynaptic cell. These parameters are expected to have the strongest effect in determining whether and in what voltage range  $i_A$  will turn on during the activity of the cell. If VA is maintained at the control value of -12 mV, variations in the value of  $V_B$  from its standard value of -62 mV to values more positive than approximately -40 mV only have any effects on the cell's rebound from a simulated IPSP. At  $V_{\rm B} = -40$  mV (Fig. 11, middle), there is a small increase in the latency to the first action potential and a decrease in firing frequency. If  $V_B$  is kept constant at the value set for the standard version of the model, and  $V_A$  is lowered by  $\sim 30$  mV, a dramatic increase in the delay of the postinhibitory firing occurs (Fig. 11, bottom), accompanied by a decrease in firing frequency. More negative values of  $V_A$  have even stronger effects, eventually abolishing spiking activity completely.

#### DISCUSSION

One of the difficult problems in neurobiology is understanding how each of the conductances present in a neuron shapes that neuron's electrical properties. In this paper we demonstrate that the role of several conductances changes when the cell moves from one voltage range to another, as is the case when  $i_{\rm proc}$  is included in our standard model. Although this result is not unexpected, there is no obvious a priori way to predict, from voltage-clamp experiments on isolated currents alone, what each current will contribute to the dynamic pattern of activity of the neuron.

Proctolin is found in identified modulatory inputs to the STG (Nusbaum and Marder 1989a,b). The stimulation of the proctolin-containing neurons, or the exogenous appli-

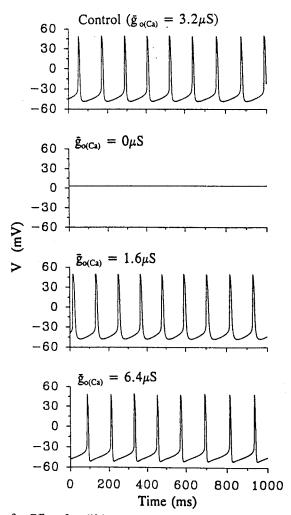


FIG. 8. Effect of modifying  $i_{o(Ca)}$  on the activity of the model cell. Standard model with  $i_{proc}$  turned off.  $\bar{g}_{o(Ca)}$  values for each condition are indicated on the *top left corner* of each panel. Notice the effect on action-potential duration and the lack of effect on firing frequency.

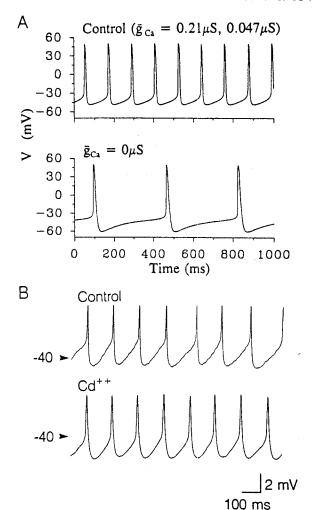


FIG. 9. Effect of blocking  $i_{Ca}$ . A: standard model with  $i_{proc}$  turned off. Top: control. Bottom:  $\bar{g}_{Ca}$  set to 0  $\mu$ S for both components (see Table 1 in Buchholtz et al. 1992). B: effect of  $Cd^{2+}$  on the firing activity of the experimental LP cell. LP in PTX and stn input nerve blocked. Top: control. Bottom: in 200  $\mu$ M bath-applied  $Cd^{2+}$ .

cation of proctolin, strongly excites the LP neuron (Hooper and Marder 1987; Marder et al. 1986; Nusbaum and Marder 1989a,b) (Fig. 4). Golowasch and Marder (1992b) studied the proctolin-evoked current in LP neurons and found that proctolin activates a small inward current that is markedly voltage dependent, and largest at membrane potentials close to the LP neuron's baseline membrane potential and threshold for action-potential activation. However, it was quite puzzling that a small current could produce such a dramatic increase in the frequency of the LP neuron firing. Our ability to examine individually the currents in the LP neuron with the use of the model allows us to offer an explanation for this effect. In the absence of proctolin,  $i_{o(Ca)}$  is the predominant outward current that terminates the action potential (Fig. 2). In the presence of proctolin,  $i_{o(Ca)}$  is diminished, resulting in an action potential slightly longer in duration [Fig. 5; at -20 mV the duration of the action potential is 12.0 ms in control conditions (Fig. 2, Table 1) and 13.2 ms in proctolin (Fig. 5, Table 1)]. Because id plays an important role in controlling the frequency of firing (Fig. 8), it is interesting that in the presence of proctolin the frequency increases despite the substantial increase in  $i_d$ . Presumably this occurs because the frequency that would be expected by the augmentation of  $i_d$ is overpowered by the changes in the other currents that control the frequency. Therefore it is informative to use the plots in Figs. 2 and 5 to obtain at least a qualitative understanding of the factors that control the firing rate of the LP neuron in the absence (Fig. 2) and the presence of proctolin (Fig. 5). In the absence of proctolin the interspike interval is influenced by three factors: 1) the turning off of  $i_d$ , 2) the inactivation of  $i_{Ca}$ , and 3) the recovery from inactivation of  $i_{Na}$ .  $i_{d}$  and  $i_{Ca}$  turn off in such a way that these two effects almost balance. However, although it is not evident at the scale shown in Fig. 2, an appreciable  $i_{Na}$  develops during the interspike interval, which plays an important role in bringing the cell to threshold. Proctolin adds a modest noninactivating inward current at all hyperpolarized membrane potentials. Note also, in proctolin, that there is a small permanent net inward  $i_{Ca}$  throughout the voltage range. This results in a shift of the baseline membrane potential by  $\sim 10$ mV. Once again, the interspike interval is determined by the interactions among  $i_{Na}$ ,  $i_{Ca}$ , and  $i_d$ , and it is diminished because the threshold, which remains constant in proctolin, is reached sooner from the depolarized baseline.

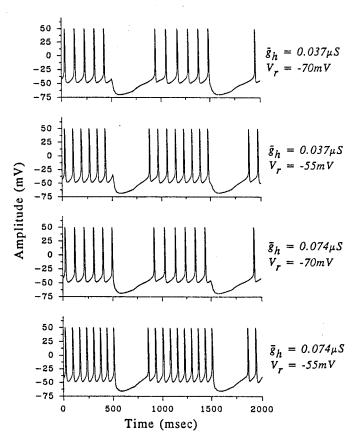


FIG. 10. Model cell's synaptic potentials: effect of  $i_h$ . Parameters as listed in Table 1 of Buchholtz et al. (1992). Presynaptic activity is bursts of 10 IPSPs at 50 Hz every 1 s. Top: control. Parameter modifications are indicated to the *right* of each trace. Notice the dramatic effect on the phase at which the burst begins after synaptic activity.

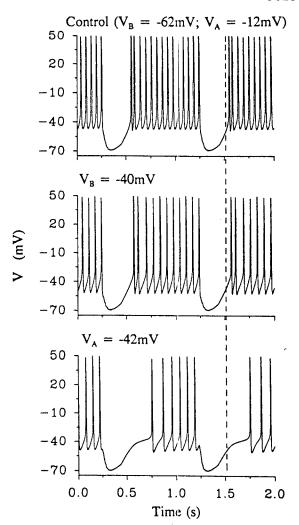


FIG. 11. Model cell's synaptic potentials: effect of  $i_A$  parameters. Standard model plus  $\bar{g}_p$  set to  $\frac{1}{2}$  of its normal value to increase the firing frequency in a manner that mimics the activation of the pyloric cells by afferent fibers coming through the stn. Presynaptic activity is bursts of 10 IPSPs at 50 Hz every 1 s. Top: control ( $V_3 = -62$  mV;  $V_A = -12$  mV). Middle:  $V_B = -40$  mV;  $V_A = -12$  mV. Bottom:  $V_B = -62$  mV;  $V_A = -42$  mV. Dashed line drawn for easier comparison among panels.

An unusual feature of the firing pattern seen in proctolin is that there is an increase in both the action-potential duration (which ordinarily one would expect to retard the next action potential) and the action-potential frequency. Although the increase in action-potential duration is relatively modest (10%, measured at -20 mV, Table 1), depending on the relationship of transmitter release to action-potential duration, this could have significant implications for the release of neurotransmitter by the LP neuron, especially because the intracellular Ca<sup>2+</sup> concentration in proctolin shows a substantial increase in baseline values (Fig. 5).

Under normal physiological conditions the LP neuron receives phasic bursts of IPSPs that bring its membrane potential to values that are likely to activate  $i_h$  and deinactivate  $i_h$  and  $i_{Na}$ . Therefore we used simulated bursts of synaptic potentials to emulate conditions the LP cell is under within the network. These bring the model LP neuron into

the voltage range in which  $i_h$  and  $i_A$  are likely to influence the activity of the LP neuron. Specifically, we simulated bursts that mimic those seen in the pyloric rhythm so that the time-dependent dynamics of  $i_h$  and  $i_A$  would be appropriately studied. Figure 10 demonstrates that  $i_h$  can strongly influence the waveform of synaptic potentials as well as the recovery from inhibition in the LP neuron. Thus phase relationships in the pyloric network can depend on the properties of  $i_h$ . It should be noted that the parameter changes we have used (i.e., doubling  $\bar{g}_h$  and depolarizing by 15 mV the activation curve of  $i_h$ ) are comparable with changes induced by serotonin in a different cell of the same ganglion (O. Kiehn and R. M. Harris-Warrick, unpublished observations).

 $i_{\rm A}$  has been proposed to play a critical role in controlling the phase relationships of neurons in the pyloric rhythm (Hartline and Gassie 1979; Hartline et al. 1990). Indeed, Fig. 6 shows that  $i_{\rm A}$  in the model neuron has the well-known attributes (Connor and Stevens 1971; Connor et al. 1977) of influencing the firing frequency and the latency to the first spike after inhibition. More interestingly, Fig. 11 demonstrates that shifting the voltage dependence of  $i_{\rm A}$  activation and inactivation produces alterations in firing frequency and recovery from a simulated burst of IPSPs. This makes plausible the suggestion that differences in the properties of  $i_{\rm A}$  in different classes of pyloric network neurons (Hartline et al. 1990; Tierney and Harris-Warrick 1990) may be important determinants of the phase relationships in the pyloric rhythm.

The effect of  $i_{Ca}$  on the model cell (Fig. 9) shows that it strongly affects the baseline membrane potential and firing frequency, both of which markedly decrease when  $i_{Ca}$  is blocked. The latter effect is not observed in the real LP cell, although the baseline potential does hyperpolarize somewhat. We do not have a clear explanation for this discrepancy, but it is conceivable that  $Cd^{2+}$  blocks some residual synaptic currents that, in control conditions (Fig. 9 B, top), keep the cell from firing faster. In both the model and the real LP cell, however, blocking  $i_{Ca}$  does make action-potential duration longer, because of its indirect blocking effect on  $i_{O(Ca)}$  (compare with Fig. 8). Blocking only one of the two components of  $i_{Ca}$  in the model does not mimic the  $Cd^{2+}$  effect either.

Models such as the one we have developed here allow us to do experiments that we are unable to do with biological preparations. Pharmacological agents that block completely one current without influencing others are rare. Moreover, in biological preparations it is very difficult to alter cleanly the maximal conductance of most currents. Although we were surprised by several of the results of our simulations, we are pleased that, once the model was constructed (Buchholtz et al. 1992), its responses to many of the perturbations presented in this paper mimicked well the results of biological experiments. Despite the inordinate complexity of a cell with so many dynamical variables, it is gratifying that the model neuron in most regards reinforced the intuitions we and others have obtained from voltage-clamp measurements.

The process of model construction forcefully reminds the physiologist of many unanswered problems. Specifically,

there is intrinsic variability in all biophysical measurements. For example, the values of maximal conductance for any current might differ from preparation to preparation. Indeed, the extent of this variability is often of the same magnitude as the perturbations of the model neuron investigated here. Fits to  $i_d$  in the LP cell of six different animals gave half-maximum potentials of activation  $(V_n)$ in the range of -14 to +5 mV, step width of activation  $(s_n)$ in the range of -22 to -11 mV, and maximum conductances  $(\bar{g}_d)$  in the range of 0.25–0.35  $\mu$ S. This indicates that a large variability occurs in the different parameters that define this and other currents. However, biological neurons retain with extreme fidelity their characteristic electrical signatures. This may mean that most of the variability in physiological measurements is induced by the experimental procedure. Alternatively, neurons may have interesting compensatory feedback mechanisms that allow them to produce their essential patterns of activity despite modifications in some aspects of their currents. If so, this indicates the existence of important cellular processes not taken into account in this or similar models, as models are not often extremely robust with respect to parameter modifications. Our work thus highlights a fundamental puzzle of neuroscience: if the electrical activity of a neuron that confers on it its essential characteristics is so tied to the correct balance of many different conductances, how are these regulated so that the neuron retains its physiological identity throughout its lifetime, despite protein turnover and growth? Although mathematical models may not provide an answer to this question, they can help us understand the boundaries within which neurons must operate.

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