# Theta Phase Precession Emerges from a Hybrid Computational Model of a CA3 Place Cell:

#### **Supplementary Description of the Computational Model**

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#### Overview

These supplementary materials provide a description for the computational model used in the associated research article. Source code for the model is publicly available via ModelDB (Hines et al., 2004) and contains additional commentary on the structure and rationale of the model.

The model described here simulates movements of a mouse in a maze and from this generates representative spike trains afferent to a single "target" CA3b pyramidal cell. Mouse movement and afferent spike trains are generated using phenomenological models while the target pyramidal cell is simulated using a biophysically realistic compartmental model (Figure S1).



Figure S1. General model schematic showing afferent cell groups and target cell relationship. Place cell firing is determined by the location of a simulated animal moving within a maze. Afferent cell groups are entorhinal cortex (EC), which provides perforant path (PP) inputs, CA3 peer pyramidal cells, which provide associational connection (AC) inputs, and dentate gyrus (DG) granule cells, which provide mossy fiber (MF) inputs. Interneurons are divided into four separate population subgroups: axo-axonic cells (AA), basket cells (BC), bistratified cells (BS), and cells with soma in the stratum oriens and axons in strata lacunosum-moleculare (OL-M). This is figure also appears in the main body of the article and is included here for completeness.

A primary objective of the combined model is to allow realistic modeling of CA3 pyramidal cell responses to *in vivo* conditions without incurring the cost and complexity of simulating the entire hippocampus or other associated brain regions.

#### **Simulated Environment**

The simulated environment used in the current model has been chosen to be similar to an experiment that demonstrates the critical nature of synaptic plasticity in CA3 (Nakazawa et al., 2002). A simulated mouse moves within a 50-cm square maze in which movement is restricted to a counter-clockwise path that maintains a roughly constant distance from the maze boundary. Throughout the simulation, the mouse moves at a constant speed of 10 cm/sec.

### **Afferent Place Cell Firing Models**

A phenomenological model of afferent place cell firing is used to provide inputs to the target cell. As the simulated mouse moves through the maze, the simulated firing rates of cells in entorhinal cortex (EC), dentate gyrus (DG), and CA3 pyramidal cells vary based on the current location and heading of the mouse. Instantaneous firing rates are used to generate each afferent cell's spike train as an inhomogenous Poisson process with a minimum refractory interval of 5 ms through the use of a spike thinning algorithm (Dayan and Abbott, 1971).

Location specific firing rates are determined using a phenomenological model of place field firing similar to prior hippocampal models (O'Keefe and Burgess, 1996; Wallenstein and Hasselmo, 1997; Hartley et al., 2000; Káli and Dayan, 2000). The place cell model used here is generalized to support arbitrary maze geometry. For each afferent place cell, a local spatial coordinate system is imposed with its origin at the place field center and one axis oriented towards the maze boundary point nearest the cell's place field center. Afferent place cell firing rates are formulated in terms of the corresponding local coordinate system using the relationship

$$\sigma_{X} = \sigma_{0} + \rho_{dist} |b_{X}|,$$

$$\sigma_{Y} = \sigma_{0} + \rho_{dist} |b_{Y}|,$$

$$F_{loc}(x, y) = \frac{F_{avg}}{2\pi\sigma_{X}\sigma_{Y}} \exp\left[\frac{-x^{2}}{2\sigma_{X}^{2}} + \frac{-y^{2}}{2\sigma_{Y}^{2}}\right]$$
(1)

where  $b_X$  and  $b_Y$  are the distance to the closest maze boundary along the local coordinate X and Y axes,  $\sigma_X$  and  $\sigma_Y$  are derived standard deviates,  $\sigma_0$  is the minimum standard deviate,  $\sigma_{dist}$  reflects the relative error in distance estimates,  $F_{loc}$  is the location-dependent firing rate at local coordinates (x,y), and  $F_{avg}$  is the theoretical mean firing rate for the place cell. Parameters  $\sigma_{0, \rho}$ , and  $F_{avg}$  are parameters of the population (EC, DG, or CA3) of which the place cell is a member while  $b_X$  and  $b_Y$ are specific to the individual place cell. Place field center locations for afferent place cells are chosen randomly with a uniform distribution throughout the interior of the maze.

Place cell firing is affected by rhythmic theta and gamma oscillatory patterns (Buzsáki, 2002; Csicsvari et al., 2003) and the phenomenon of theta phase precession (O'Keefe and Recce, 1993). Let (x,y) be the current position of the simulated animal, let  $(h_x,h_y)$  be a unit vector indicating the current heading, and let *t* be the current time. The instantaneous firing rate of a given place cell is then found by

$$\Delta_{\theta} = \theta_{PC} + \rho_{tpp} \left( x \cdot h_{x} + y \cdot h_{y} \right),$$
  

$$F(t, x, y) = F_{loc} \left( x, y \right)$$
  

$$\times \left[ 1 + A_{\theta} \cos(2\pi f_{\theta} \cdot t - \Delta_{\theta}) \right]$$
  

$$\times \left[ 1 + A_{y} \cos(2\pi f_{y} \cdot t) \right]$$
(2)

where  $\theta_{PC}$  is the peak firing theta phase for the cell type,  $\Delta_{\theta}$  is the combined theta phase offset including theta phase precession,  $\rho_{tpp}$ is the linear rate of phase precession,  $A_{\theta}$  is the amplitude of theta modulation,  $f_{\theta} = 8$  Hz is the frequency of theta oscillation,  $A\gamma$  is the amplitude of gamma modulation,  $f\gamma = 40$ Hz is the frequency of gamma oscillation,  $F_{loc}(x,y)$  is the location-dependent firing rate, and F(t,x,y) is the derived instantaneous firing rate at time *t* and location (x,y) for the given afferent place cell.

Place cells properties are chosen to generally reflect experimental findings. The associated place field has been adjusted because of the smaller mazes used here. Dentate gyrus place cells are spatially selective and have low average activity rates (Jung and McNaughton, 1993; Skaggs et al., 1996). CA3 place cells are intermediate in spatial selectivity and activity (Muller, Kubie, and Ranck, 1987; Brazhnik, Muller, Vazdarjanova and Fox. 2003; and Guzowski, 2004). Entorhinal cortex place cells are modeled with properties similar to those of CA3 place cells (Fyhn et al. 2004; see also Quirk et al, 1992). Peak theta phase firing for each type of place cell is similarly chosen based upon experimental findings (Fox, Wolfson, and Ranck, 1986; Stewart, Quirk, Barry, and Fox, 1992). Tables S1 and S2 summarize parameters used in modeling afferent place cells.

### **Interneuron Firing Models**

Because interneuron firing is minimally affected by location and heading,  $F_{loc}$  is constant and the theta phase precession rate  $K_{TPP}$  is zero for interneurons, allowing formula (2) to be applied without change.

		0	1					
Afferent	Group	Active	Peak	Theta	Gamma	Target Cell	Synapse	Synapse
Cell	Рор	Freq	Theta	Mod	Mod	Synapses	Laminar	Receptor
Group	Size	(Hz)	Phase	$(A_{\theta})$	$(A_{\gamma})$	(typical)	Extent (µm)	Types
EC II-III	2,000	2	5°	1.0	0.5	1,348	350-500 apical	AMPA, NMDA
DG	4,000	1	296°	1.0	0.5	43	0-100 apical	AMPA, NMDA
CA3 Peer	12,000	2	19°	0.75	0.2	5,362	100-350 apical	AMPA, NMDA
						4,622	0-300 basal	AMPA, NMDA
Axo-axonic	100	17	185°	1.0	0.0	200	IS	GABAA
Basket Cell	100	8	271°	0.6	0.0	200	soma	GABAA
Bistratified	500	6	359°	1.0	0.0	2,565	all dendrites	GABA <sub>A</sub> , GABA <sub>B</sub>
OL-M	100	5	19°	0.8	0.0	335	350-500 apical	GABA <sub>AS</sub> , GABA <sub>B</sub>

Table S1. Afferent cell group network parameters

Laminar extent is measured from the target cell soma in apical or basal directions. Active frequency is approximate, depending on maze and path. The number of target cells synapses varies based on random assignments. Abbreviations: population (pop), frequency (freq), modulation (mod), initial segment (IS), GABA<sub>A</sub> slow (GABA<sub>AS</sub>). This is table also appears in the main body of the article and is included here for completeness.

Table S2. Afferent place field spatial parameters

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Afferent	Fraction	$F_{avg}$	$\sigma_0$	$\rho_{dist}$	$ ho_{tpp}$
Cell Group	Active	(Hz)	(cm)		(deg/cm)
EC II-III	100%	0.4	3.5	0.15	10
DG	5%	0.2	2.0	0.10	10
CA3 Peer	18%	0.4	3.5	0.15	10

Abbreviations and symbols: average firing rate when no boundaries are present ( $F_{avg}$ ), minimum standard deviate for firing rate Gaussian function ( $\sigma_0$ ), standard deviate distance ratio ( $\rho_{dist}$ ), theta phase precession spatial rate ( $\rho_{tpp}$ ), degrees (deg).

Peak theta phase and nominal firing rate derived from experiments are bv Klausberger et al. (2003, 2004) and are shown in Table S1. While basket cell population rates approximately are sinusoidal, as assumed in formula (2), a better approximation of population activity at theta frequencies is a saw-tooth wave. In the current model, basket cell theta frequency modulation is based on such a saw-tooth variation consisting of straightline rising and falling intervals that has a minimum average firing rate near 0° theta phase and a maximum at 271°, as indicated in Table S1.

Interneuron firing rates are assumed to be variable in response to afferent stimulation, brain state, and environmental novelty (Wilson and McNaughton, 1993; Klausberger et al., 2003, 2004). Interneuron afferents are not explicitly included in the current model, but interneuron firing rates are modulated by a long-term average of the target cell firing rate. Target cell firing rates are estimated using a kernel smoothing function with a decay time constant of 60 sec. Interneuron firing rates of basket cell and bistratified interneurons are specified by the relationship

$$F_{IN} = F_{base} + \frac{F_{inc}}{1 + \exp\left(-\frac{F_{TC} - F_h}{k_{IN}}\right)}$$
(3)

where  $F_{IN}$  is the instantaneous interneuron firing rate,  $F_{base}$  is the baseline interneuron firing rate appearing in Table S1,  $F_{inc}$  is the maximum firing rate increment,  $F_{TC}$  is the smoothed target cell firing rate,  $F_h = 3$  Hz is a half-increment rate parameter, and  $k_{IN} =$ 0.5 Hz is a firing rate sensitivity parameter.  $F_{inc}$  is estimated based on the difference in firing rates between theta and sharp-wave ripple states (Klausberger et al, 2003, 2004).  $F_{inc}$  has a value three times the baseline rate for basket cells and bistratified interneurons and is zero otherwise. It should be noted that individual interneurons have diverse firing patterns based on their individual characteristics and afferent stimulation (Fox, Wolfson, Ranck Jr., 1986; Klausberger et al, 2003, 2004). The present model is limited to reproducing interneuron population activity on the assumption that proximate excitatory and inhibitory synapses show minimal highorder temporal correlations as they impinge upon the target pyramidal cell.

## Target Cell Compartmental Model

Morphology of the target cell (Figure S1) is derived from the morphology of cell L56a as described in the Duke/Southampton Cell Archive (Turner et al., 1995). The cell morphology file for cell L56a in SWC format was converted for use in a compartmental model (Segev and Burke, 1998) in which cylindrical compartments representing dendritic segments have a length of approximately 50 µm and a radius that conserves the membrane area implied by measurements of the corresponding portion of the dendrite from the morphology file. Compartments are constrained such that dendrite branches only appear as connections between compartments. Along a compartment, the corresponding largest and smallest radius values from the SWC file differ by no more than 25%. During the conversion process, compartments are subdivided as needed to meet these constraints. The target cell soma is modeled as a spherical compartment with a membrane area of 1645  $\mu$ m<sup>2</sup>.

Only the soma and dendrites are converted from the SWC morphology file. An initial segment (IS) and axon segment have been added to the target cell model to allow the simulation of both axonal contributions to cell firing and inhibitory effects on the initial segment. The initial segment model consists of a single compartment with length 30 µm and radius 0.7  $\mu$ m. Ten axon compartments are connected one to another, each with a length 30  $\mu$ m and a radius that tapers from 0.5  $\mu$ m in the most proximal axonal compartment down to 0.2  $\mu$ m in the most distal axonal compartment simulated.

Passive parameters of the target cell have been chosen so that passive membrane properties in combination with ion channels yield properties near rest similar to passive whole cell properties of CA3 pyramidal cells at physiological temperatures (Spruston and Johnston, 1992). When acetylcholine (ACh) is present as a modulator, a non-selective mixed-cation channel is assumed to be opened such that the target cell is otherwise experiences depolarized but minimal change in passive properties (Guérineau, Bossu, Gähwiler, and Gerber 1995). Passive properties of the axon have been chosen based on minimal active repolarization of the axon (Colbert and Pan, 2002) and axon response to somatic stimulation. Table S3 summarizes the passive cell parameters used in the target cell model.

Intracellular calcium dynamics are modeled using the scheme described by Jaffe et al. (1994) with adjustments for more recent results regarding dendritic calcium dynamics (Sabatini, Oertner, Svoboda, 2002). Table S4 contains parameters used in modeling target cell calcium dynamics.

Calcium microdomains near the cell membrane are modeled as a single thin

Table S3. Target cell passive parameters

Parameter	Value
Membrane capacitivity	$1 \mu\text{F/cm}^2$
Membrane resistivity	200 Kohm-cm <sup>2</sup>
Membrane resistivity (axon)	$750 \text{ ohm-cm}^2$
Axial resistivity	100 ohm-cm
Leakage reversal potential	-90 mV
Leakage reversal for axon	-74 mV
Mixed-cation conductivity	$0.0015 \text{ mS/cm}^2$
Mixed-cation reversal	0 mV

Table S4. Calcium pool model parameters

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Parameter	Value
Internal calcium rest	50 nM
External calcium	2 mM
Unbound ion ratio	$0.013 (\kappa_{\rm B}=75)$
Pump half-activity value	2 μΜ
Maximum pump rate	$1.5 \cdot 10^{-12} \text{ mM} \cdot \text{ms}^{-1} \cdot \text{cm}^{-2}$
Microdomain subshell depth	0.1 μm

subshell in which calcium is assumed to be of well mixed. Only high- and mediumvoltage activated calcium channels influxes contribute to the microdomain subpool concentration since these are the channels coupled with calcium-activated potassium channels (Marrion and Tavalin, 1998). While experimentally relevant, overall calcium concentration outside the microdomain does not play an active role in the current model. Calcium flux through channels is assumed to follow the Goldman-Hodgkin-Katz (GHK) formula as rewritten by Jaffe et al. to allow incorporation of experimentally measured calcium channel conductance

$$I_{CA}(V) = g_{Ca}V \frac{1 - \frac{[Ca^{2+}]_{in}}{[Ca^{2+}]_{out}} \exp\left(\frac{zFV}{RT}\right)}{1 - \exp\left(\frac{zFV}{RT}\right)} \quad (4)$$

where  $I_{Ca}$  is the calcium current,  $g_{Ca}$  is the effective conductance of the calcium channel, V is the membrane potential,  $[Ca^{2+}]_{in}$  is the intracellular calcium ion concentration,  $[Ca^{2+}]_{out}$  is the extracellular calcium concentration, z is the ion charge (+2 for calcium), F is Faraday's constant, R is the gas constant, and T is the absolute temperature. It should be noted that the GHK formula is based on assumptions that are not entirely satisfied by calcium channel pores. The accuracy of the formula as a predictor of currents in some calcium

channels may be limited (Brown et al., 1993).

Ion channels are modeled using the Hodgkin-Huxley independent gating model (Hodgkin and Huxley, 1952). Individual channel gates are modeled using a variation on the extended form of Hodgkin-Huxley equations proposed by Borg-Graham (1999). For a gating state variable *X*, dynamics are determined through the system of equations

$$\begin{aligned} \alpha_{bolt} &= r \exp\left[\gamma \cdot \left(V - V_{half}\right)/k\right], \\ \beta_{bolt} &= r \exp\left[-\left(1 - \gamma\right) \cdot \left(V - V_{half}\right)/k\right], \\ X_{\infty}(V) &= \frac{\alpha_{bolt}}{\alpha_{bolt} + \beta_{bolt}}, \\ \tau(V) &= \frac{Q_{10}^{(T_{rated} - T)/10}}{\alpha_{bolt} + \beta_{bolt}} + \tau_{0}, \end{aligned}$$
(5)  
$$\alpha_{X} &= \frac{X_{\infty}(V)}{\tau(V)}, \ \beta_{X} &= \frac{1 - X_{\infty}(V)}{\tau(V)}, \\ \frac{dX}{dt} &= \alpha_{X} \cdot (1 - X) + \beta_{X} \cdot X \end{aligned}$$

where k is the voltage sensitivity measured experimentally,  $\alpha_{bolt}$  and  $\beta_{bolt}$  are theoretical activation and deactivation rates,  $\alpha_X$  and  $\beta_X$ are corresponding rates for X adjusted to allow for a rate limiting process and the simulation temperature,  $\tau_0$  is a rate limiting time constant, r a gating rate parameter, V is the membrane potential,  $V_{half}$  is the halfactivation voltage,  $\gamma$  is the relative energy barrier location,  $T_{rated}$  is the absolute temperature at which gating kinetics were measured, T is the simulated temperature,  $Q_{10}$  is a temperature correction parameter, and  $\tau(V)$  and  $X_{\infty}(V)$  are the voltagedependent time constant and equilibrium values of X. The rate value r is more conveniently expressed in terms of the time constant  $\tau_{max}$ , which is the maximum value of  $\tau(V)$  for any voltage. Simulation software automatically derives the value for r from  $\tau_{max}$  and other gating parameters.

ACh modulation is modeled based on the effect of muscarinic receptor activation on the peak channel conductance of modulated channels using a method adapted from an earlier model of ACh effects (Menschik and Finkel, 2000) with the following formula

$$g_{\text{mod}} = g_{\text{max}} \left( 1 + A \frac{[\text{ACh}]}{[\text{ACh}] + Kd} \right)$$
(6)

where  $g_{mod}$  is the peak channel conductance after modulation is applied,  $g_{max}$  is the specified peak conductance before modulation, [ACh] is the extracellular ACh concentration, *A* the maximum effect for this channel, and *Kd* the concentration at which the effect is half the maximum.

Table S5 contains parameters for ion channels using the extended Hodgkin-Huxley formulation above. Ion channel currents are derived using Ohm's law except for calcium channels, in which case the GHK formula is applied. The simulation software applies adjustments to channel kinetic properties using an assumed brain temperature of 37 °C.

The target cell model utilizes multiple models of transient sodium channels (NaT) to represent regional variations in channel properties. Transient sodium channels in dendrites (Magee and Johnston, 1995; Pan and Colbert, 2001; Gasparini and Magee, 2002) are modeled separately from those in the soma and the axon (Colbert and Pan, 2002). For non-axonal sodium channels, slow inactivation is included in the model (Mickus, Jung, and Spruston, 1999). Persistent sodium currents (NaP) are also included in the model and are modeled as a simplified representation of results from channels found in the entorhinal cortex cells (Magistretti and Alonso, 1999, 2002).

Fast inactivation of transient sodium channels is not well fit by equation (4) because of the interaction between channel opening and inactivation (Gasparini and Magee, 2002). The expression for h-gate deactivation is amended to be

$$\beta_h(t) = \beta_h(V) + k_{act} m^3(t)$$
(7)

where  $k_{act} = 1.5/\text{ms}$  is the contribution of channel open states to inactivation. Transient sodium channel slow inactivation is incomplete and the slow inactivation *s*gate variable is rescaled by amending the steady-state voltage sensitivity of slow inactivation to be

$$s_{\infty}(V) = 0.12 + 0.78 \frac{\alpha_{bolt}}{\alpha_{bolt} + \beta_{bolt}}$$
(8)

where the value 0.12 is chosen so that the product of steady-state h and s gating values is approximately a Boltzmann function of voltage conforming with experimental sodium measurements of channel inactivation. When the ACh is present, slow inactivation is inhibited in somatic and proximal dendritic sodium channels but not distal dendritic sodium channels (Tsubokawa and Ross, 1997). When ACh is present at concentrations exceeding 0.1 µM,  $s_{\infty}=0.6$  for somatic and proximal dendritic sodium channels

The model of Ih currents is derived from the characterization by Magee (1998). Extracellular concentrations of sodium affect properties of this channel including a shift in voltage sensitivity, altered time constants, and reversal potential. To the extent possible, the current model of Ih is derived from experimental results using near physiological solutions.

Delayed rectifier (Kdr) and transient forms (K-A) of potassium channels included in the target cell model have the voltage sensitivity measured by Hoffman, Magee, Colbert, and Johnston (1997). Peak conductance of these potassium channel

Channel	g <sub>max</sub>	V <sub>rev</sub>	ACh	ACh	Gating	Gate	γ	V <sub>half</sub>	k	$\tau_{max}$	$\tau_0$	Temp
Туре	(mS/	(mV)	А	Kd	Terms	Var	•	(mV)	(mV)	(ms)	(ms)	(°C)
	$cm^2$ )			(µM)								/ Q <sub>10</sub>
NaT soma	30.0	+55.0	-0.35	95	m <sup>3</sup> hs	m	0.5	-42.9	8.4	0.2	0.05	22 / 4.0
and IS						h	0.2	-50.0	-8.0	45	0.4	22 / 2.0
						S	0.5	-66.0	-5.3	1300	800	37 / 2.0
NaT prox	40.0	+55.8	-0.35	95	m <sup>3</sup> hs	m	0.5	-25.5	10.0	0.2	0.05	22 / 4.0
-						h	0.2	-50.0	-8.0	45	0.4	22 / 2.0
						S	0.5	-66.8	-6.8	1300	800	37 / 2.0
NaT distal	10.0	+54.4	-0.35	95	m <sup>3</sup> hs	m	0.5	-34.1	10.1	0.2	0.05	22 / 4.0
						h	0.2	-50.0	-8.0	45	0.4	22 / 2.0
						S	0.5	-63.6	-6.3	1300	390	37 / 2.0
NaT axon	60.0	+55.0	0	0	m <sup>3</sup> h	m	0.5	-48.4	7.3	0.5	0.05	22 / 4.0
						h	0.2	-69.0	-5.3	45	0.4	22 / 2.0
NaP soma	0.2	+55.0	-1.0	0.1	mh	m	1.0	-51.3	4.0	18	0.3	22 / 1.0
and prox						h	0.2	-48.4	-10	6s	2s	22 / 1.0
Ih prox	0.004	-25.0	0.4	1	q	q	0.6	-73.0	-7.0	50	19	33 / 4.5
Ih distal	0.004	-25.0	0.4	1	q	q	0.6	-81.0	-7.0	50	19	33 / 4.5
Kdr axon	10.0	-85.0	0	0	n	n	0.8	13.0	11.0	8.0	1.0	22 / 4.0
Kdr other	3.0	-85.0	0	0	n	n	0.8	13.0	11.0	8.0	1.0	22 / 4.0
					4							
K-A prox	1.2	-85.0	-0.3	0.1	a <sup>4</sup> b	а	0.5	-27.1	22.9	1.0	1.0	35 / 4.0
K-A distal	1.2	-85.0	-0.3	0.1	a⁴b	а	0.5	-32.8	19.1	1.0	1.0	35 / 4.0
K-A all						b	0.5	-56.0	-8.0	na	5.0	35 / 1.3
K-M	0.3	-78.0	-1.0	64	m	m	na	-39.8	5.2	150	0.0	30 / 5.0
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K-C	0.3	-91.0	0	0	c	с	na	na	na	22	4.0	22 / 4.0
K-AHP	0.5	-91.0	0	0	q	q	na	na	na	22	1.0	22 / 1.0
~	• •	~~~~			2.						•	
Ca-T	2.0	GHK	1.0	1.7	m²h	m	0.7	-36.2	7.0	20	3.0	22/1.7
						h	0.8	-80.0	-6.4	35	10.0	22 / 2.5
			<u> </u>		2.		~ <b>-</b>	• • •	<u> </u>		<u>.</u>	
Ca-R/N	1.5	GHK	0.4	1.6	m²h	m	0.5	-20.3	9.4	1.2	0.4	22/2.0
						h	0.5	-54.0	-9.2	100	100	22 / 2.0
<u> </u>			- <b>-</b>		2		~ <b>-</b>	10.5			<u>.</u>	
Ca-L	1.2	GHK	0.7	1.7	m	m	0.5	-12.2	7.0	1.2	0.4	22 / 2.0

Table S5. Target cell ion channel model parameters

Abbreviations: theoretical maximum conductance  $(g_{max})$ , reversal potential  $(V_{rev})$ , acetylcholine (ACh), maximum ACh effect (A), half-effect concentration (Kd), variable (var), rated temperature (temp), proximal (prox), not applicable (na), seconds (s), Goldman-Hodgkin-Katz formula (GHK), initial segment (IS), transient sodium channel (NaT), persistent sodium channel (NaP), delayed rectifier (Kdr), type-A potassium channel (K-A), muscarinic potassium current (K-M), calcium-activated potassium channel (K-C), after-hyperpolarization potassium current (K-AHP), type-T low-voltage activated calcium channel (Ca-T), types-R and N medium-voltage activated calcium channel (Ca-L). See equation (5) and associated text for other symbols and terms.

types in the model were chosen based on the ratio of Kdr and K-A found in CA3 pyramidal cells of adult rats (Klee, Ficker, and Heinemann, 1995). K-A channel inactivation is approximately a linear function of the membrane potential and cannot be fit adequately using equation (5). The time constant for K-A inactivation gating is found with the relationship

$$V_{\min} = V_0 + \frac{\tau_0}{\eta}$$

$$\tau(V) = \frac{\eta \cdot (V - V_{\min}) \cdot Q_{10}^{(T_{rated} - T)/10}}{1 - \exp(-(V - V_{\min})/k)} + \tau_0$$
(9)

where  $V_0 = -56$  mV is the membrane potential at which the empirical linear relationship extrapolates to a zero time constant,  $\eta = 0.26$  ms/mV is an empirical constant,  $V_{min}$  is a value controlling voltages over which the relationship is non-linear,  $\tau(V)$  is the time constant of gating variable b,  $\tau_0$  is a rate limiting time constant,  $Q_{10}$ ,  $T_{rated}$ , and T are as above, and k = 5 mV is a steepness parameter controlling the minimum value approach to а at hyperpolarized potentials.

Properties of the K-M current are based on measurements using physiological calcium concentrations as opposed to different results obtained with calcium free solutions (Selyanko and Brown, 1999). Time constants for the K-M current are found by

$$\Delta V = V - V_{half},$$
  

$$\tau(V) = \frac{r \cdot Q_{10}^{(T_{rated} - T)/10}}{\exp\left(\frac{\Delta V}{k_1}\right) + \exp\left(\frac{\Delta V}{k_2}\right)}$$
(10)

where  $k_1 = 45$  mV,  $k_2 = -10$  mV, and the resulting time constant is  $\tau(V)$ . The value of *r* is chosen so that for the rated temperature, the maximum resulting time constant has the  $\tau_{\text{max}}$  value shown in Table S5. The  $Q_{10}$  value used in modeling this current is derived from results by Halliwell and Adams (1982).

The calcium-activated potassium channel (K-C) is modeled using the formalism of Moczydlowski and Latorre (1983) with the exception that parameters have been rescaled to conform with calcium concentration sensitivities measured in hippocampal neurons (Gong, Gao, Huang, and Tong. 2001). Activation and deactivation rates without temperature adjustments for K-C are given by

$$\alpha_{bolt} = \frac{0.48 \text{ ms}^{-1} \cdot \chi}{\chi + \frac{k_1}{\kappa_{Ca}} \exp\left(0.84 \cdot \frac{V}{\kappa_V} \cdot \frac{zF}{RT}\right)},$$

$$\beta_{bolt} = \frac{0.28 \text{ ms}^{-1}}{1 + \frac{\chi \cdot \kappa_{Ca}}{k_2} \exp\left(1.0 \cdot \frac{V}{\kappa_V} \cdot \frac{zF}{RT}\right)}$$
(11)

where  $\chi$  is the calcium concentration, *V* is membrane potential,  $k_1$ =180 µM,  $k_2$ =11 µM,  $\kappa_{Ca}$ =16 is a calcium scaling factor,  $\kappa_V$ =1.95 is a voltage scaling factor, and *zF/RT* is as above.

A simplified model is used to represent the after-hyperpolarization current K-AHP. The current model follows the formalism proposed by Migliore et al. (1995) except that the half-activation value for intracellular calcium has been rescaled to be 600 nM corresponding with experimentally measured values (Hirshchberg, Maylie, Adelman, and Marrion, 1999). Model equations for K-AHP are based on the alpha-beta formalism

$$\alpha = (200 \text{ ms})^{-1} \cdot (\chi/600 \text{ nM})^4,$$
  

$$\beta = (200 \text{ ms})^{-1}$$
(12)

where  $\alpha$  and  $\beta$  are activation and deactivation rates and  $\chi$  is the microdomain

calcium concentration. In the current model, ACh indirectly modulates K-AHP because calcium influxes for medium and highvoltage activated calcium channels are reduced by ACh modulation. No explicit modulation of K-AHP by ACh is included in the current model. Temperature dependencies are also not addressed in the current model.

Three categories of calcium channels are included in the target cell model. These correspond with low, medium, and highvoltage activated calcium channel types and Johnston, (Fisher, Gray 1990; Takahashi, Ueno, and Akaike, 1991; Brown, Schwindt, and Crill 1993; Magee and Johnston, 1995; Avery and Johnston, 1996; Kavalali et al., 1997). The model for medium-voltage activated calcium currents is a composite of R, N, and possibly P-type calcium channel currents. Low-voltage activation of the L-type calcium channel is not addressed in the current model.

Some channel activation processes do not conform with the assumptions of independent gating. For example, a channel gating expression of  $m^2h$  implies that channel activation should be slower than deactivation whereas this may not actually be the case. In such cases, the  $m^2$  term is used in the current model to derive voltage sensitivity, that is the  $X_{\infty}(V)$  term, but gate activation and deactivation rates are determined by the time constant term  $\tau(V)$ alone, effectively treating the exponent of m as one in determining channel kinetics. Cases in which this applies are the activation gate of the transient potassium channel K-A (Hoffman et al., 1997; Martina et al., 1998) and activation gating of calcium channels Ca-R and Ca-L (Brown et al., 1993).

Many channels are thought to have uniform properties throughout the cell or else no differences have been experimentally characterized. Channels are represented in the current model as

uniformly distributed throughout the soma and dendrites of the target cell. Exceptions to this general rule are NaT, Ih, Kdr, K-A, and K-C channels. These channels have properties different when measured experimentally at proximal locations near the soma and at more distal locations. For the current model, the dendritic region between a point adjacent to the soma and a path distance 150 µm from the soma is assumed to be a region of transition for channel properties. For example, the peak conductivity of K-C channels is reduced over this region and is virtually absent in more distal dendrites (Poolos and Johnston, 1999). This is reflected in the current model as a linear decrease in K-C conductivity from a maximum value adjacent to the soma to zero at dendrite locations with a path distance of 150 µm or more from the soma.

Phosphorylation effects cause а difference in NaT sodium channel properties along the somato-dendritic axis (Gasparini and Magee, 2002). In the current model, this is represented using separate sodium channel models for proximal and distal dendrite channel types. Similarly, regional variations in K-A, and Ih channels have been found experimentally (Hoffman et al., 1997; Magee, 1998). In these cases, channel properties are smoothly blended along the dendrite up to the proximal-distal demarcation point at a path distance of 150 μm from the soma. Activation and inactivation rates for blended channel gates are determined by

$$\rho_{blend} = \min(1, x/150 \,\mu m),$$

$$\alpha_{blend} = (1 - \rho_{blend}) \alpha_{prox} + \rho_{blend} \alpha_{dist}, \quad (13)$$

$$\beta_{blend} = (1 - \rho_{blend}) \beta_{prox} + \rho_{blend} \beta_{dist}$$

where x is path distance from the soma to the location of the blended channel,  $\rho_{blend}$  is the derived blending ratio,  $\alpha_{prox}$  and  $\beta_{prox}$  are the activation and deactivation rates for the proximal form of the channel,  $\alpha_{dist}$  and  $\beta_{dist}$ are corresponding rates for the distal form of the channel, and  $\alpha_{blend}$  and  $\beta_{blend}$  are resulting blended activation and deactivation rates. Because compartments represent a portion of the dendrite with non-zero extent, channel properties may vary within a compartment. When this is the case, the effective blending ratio is averaged over the extent of the compartment as applicable.

conductivity Channel values are similarly blended smoothly along the extent of the dendrite such that the value used within the compartment represents an average of channel conductivity across the extent of the compartment. In the current model, NaT and K-C conductivities vary over the region up to 150 µm from the soma and then have constant values in more distal locations. Kdr, K-A, and Ih channels increase in conductivity as a linear function of distance from the soma. At 350 µm from the soma, the maximum extent measured experimentally, these channels have increased in conductivity by factors of 0.14, 5.2, and 5.8, respectively, over values found at the soma (g<sub>max</sub> in Table S5). Experimental finding suggest that K-A channels are more dense in thin oblique dendrites (Frick et al., 2003). To accommodate these findings, K-A channel conductivity in the model is further scaled by a three-halves power law in dendrites whenever the radius is less than 0.4 um.

Relatively little experimental data exists with regards to channel densities and properties in the basal dendrites of hippocampal pyramidal cells. For the current model, basal dendrites are treated the same as apical dendrites. Path distance from the soma is used in determining channel properties without respect to the apical versus basal distinction in location.

Ion channels of the axon and initial segment are represented in a simplified form in the current model. The initial segment compartment is populated with NaT, Kdr, and K-M channels, each with conductivity and other properties as found in the soma. Axon compartments are populated with the axonal form of transient sodium channels and Kdr potassium channels with conductivity and other properties as shown in Table S5.

## Synaptic Connection Models

The density of afferent synaptic connections used in the current model is proportional to the probability of a synaptic connection forming between a dendrite and an axon passing close to it. This method of distributing synapses is consistent with both experimental findings (Liu, 2004) and theoretical analysis (Stepanyants, Hof & Chklovskii, 2002a, 2002b). Synaptic density scales based on the area of a cylinder with a radius 1 µm larger than the associated cylindrical compartment. For each excitatory compartment. synapses are modeled here as occurring at the rate of 0.1 synapses per  $\mu m^2$  and inhibitory synapses occur at the rate of 0.025 synapses per  $\mu m^2$ . The four-to-one ratio of excitatory-toinhibitory synapses used here is based on results from hippocampal cell cultures (Liu, 2004).

In the current model, afferent place cells form at most one synaptic connection with the target cell in an appropriate laminar region (Amaral and Witter, 1989; Amaral, Ishizuka, and Claiborne, 1990). Interneurons, however, form one or more connections with the target cell, also within the appropriate laminar regions (Miles et al., 1996). The location of synaptic connections is otherwise chosen at random. Initialization random number algorithm with the controlled seed values allows the connection pattern to be reproducible from one simulation run to another.

Synaptic responses are modeled using a dual-exponent formulation (Dayan and

Abbott, 2001). Time delays for neurotransmitter release are included in the model with a default value of 250 µsec, characteristic of mammalian synapses at physiological temperatures (Sabatini and Regher, 1999).

Table S6 shows synapse model parameters for excitatory glutamatergic synapses in which  $\alpha$ -amino-3-hydroxy-5-methyl-4isoxalone propionic acid (AMPA) and Nmethyl-D-aspartate (NMDA) receptors are present. Synapse conductance values shown are for point conductances representing the conductance of a single synapse with  $g_{max}$ representing the peak conductance value achieved in response to a single afferent spike that resulted in neurotransmitter release.

NMDA receptor time constants have been found to be dependent on membrane potential (Kampa et al., 2004). The value of  $\tau_{decay}$  shown in Table S6 is derived from measurements by Flint et al. (1997) and corresponds with an estimate of the decay rate of NMDA receptor currents near cell resting potential. The voltage sensitivity of the NMDA receptor Mg<sup>2+</sup> pore blocker is a modeled here using the relationship of Jahr and Stevens (1990) as

$$B(V) = \left(1 + \frac{[Mg^{2+}]}{3.57} \exp(0.062 \cdot V)\right)^{-1} \quad (14)$$

where B(V) is the pore blockage ratio,  $[Mg^{2+}]$  is the external concentration of  $Mg^{2+}$  ions in mM, and V is the membrane potential in mV. In the model,  $[Mg^{2+}]$  is assumed to be 1.3 mM, representative of physiological conditions.

NMDA receptor currents have been found to be affected by muscarinic agonists (Grishin, Gee, Gerber, and Benquet, 2004) with synapses in CA3 responding differently from those in CA1. Careful measurement that avoids dialysis of the cell shows that for CA3 pyramidal cells a small increase in NMDA receptor currents in the presence of low concentrations of muscarine. This is incorporated into the current model using the formalism of equation (6) with A=0.39 and Kd = 1  $\mu$ M ACh. Muscarinic receptor desensitization is not addressed in the current model.

AMPA receptors for CA3-CA3 associational connection (AC) synapses and EC-CA3 perforant path (PP) synapses are affected by synaptic plasticity. The instantaneous value of AMPA receptor conductance varies in proportion to a synaptic weight for these synapse types. The  $g_{max}$  value appearing in Table S6 for AC and PP synapses is the conductance when the synaptic weight value is one. Plasticity of DG-CA3 mossy fiber (MF) synapses is not included in the model and the conductance

Table S6. Glutamate synapse model parameters

Receptor Type	g <sub>max</sub> (nS)	$R_{spine}$ (M $\Omega$ )	V <sub>rev</sub> (mV)	t <sub>delay</sub> (ms)	$\frac{\tau_{rising}}{(ms)}$	$\tau_{decay}$ (ms)	Temp / Q <sub>10</sub>
AMPA (MF)	2.0	0	0	0.25	3.0	3.0	37 / 1.0
AMPA (AC, PP)	1.0	100	0	0.25	0.6	2.5	37 / 1.0
NMDA (NR2A)	0.2	100	0	0.25	2.0	75	25/3.0

Abbreviations and symbols: peak conductance  $(g_{max})$ , spine neck resistance  $(R_{spine})$ , reversal potential  $(V_{rev})$ , neurotransmitter release delay  $(t_{delay})$ , rising time constant  $(\tau_{rising})$ , falling time constant  $(\tau_{decay})$ , rated temperature °C (temp), mossy fiber pathway (MF), CA3 associational connection (AC), perforant pathway (PP). NR2A is an NMDA receptor subunit type.

of these AMPA receptor types does not vary. Synapses with spines are modeled electrically by approximating the spine neck as a series resister (Johnston and Wu, 1995) with a resistance value within the range estimated experimentally (Svoboda, Tank, and Denk, 1996). Including spine necks in the model results in a small adjustment to the peak conductance values of affected synapses. Only the electrical effects of spine necks are addressed in the current model.

Glutamatergic synapses in the hippocampus have variable probabilities of releasing neurotransmitter in response to afferent spikes. For AC and MF synapses, the model of neurotransmitter release is based on the model of Schaffer collateral proposed neurotransmitter release by Dittman, Kreitzer, and Regehr (2000). Model parameters, as shown in Table S7, are adjusted to better conform with experimental findings for CA3 synapses (Salin, Scanziani, Malenka, and Nicoll, 1996). While PP synapses also show variable release patterns, these have not been sufficiently characterized to form a quantitative model. fixed release А probability of 0.25 is used for PP synapses.

Table S7. Glutamate synapse presynapticplasticity model parameters

P=0.201010.0				
Parameter	SC	AC	MF	PP
$F_1$	0.24	0.24	0.033	0.25
ρ	2.2	2.0	3.14	na
$\tau_{\rm F}$ (ms)	100	100	170	na
$\tau_{\rm D} ({\rm ms})$	50	50	50	na
$k_0 (sec^{-1})$	2	2	2	na
$k_{max}$ (sec <sup>-1</sup> )	30	30	30	na
K <sub>D</sub>	2	2	2	na
NT		1	30	na
Release mode		prob	cont	prob

Abreviations: Schaffer collateral (SC), CA3 associational connection (AC), mossy fiber pathway (MF), perforant path (PP), not applicable (na), probabilistic (prob), continuous (cont). See Dittman, Kreitzer, and Regehr (2000) for parameter definitions and model equations.

Because MF synapses have multiple release sites (Henze, Urban, and Barrionuevo, 2000), MF neurotransmitter release is treated as a continuous value. For other synapses, neurotransmitter release is modeled as a Bernoulli trial probabilistic event.

In CA3, modulation of presynaptic release probabilities by ACh depends on synapse type (Hasselmo, Schnell, Barkai, 1995). AC glutamatergic synapses are affected to a greater extent than PP synapses. Equation (6) approximately fits experimental data for associational synapse effectiveness when A = -0.8 and  $K_d = 45$ µM. This is applied in the current model by adjusting presynaptic release parameter values for affected synapses based on the concentration. ACh Values assumed affected are initial release probability, facilitating, and depressing calcium entry amounts, that is, F1,  $\Delta_{\rm F}$ , and  $\Delta_{\rm D}$ , respectively.

Table S8 contains parameters used for modeling inhibitory synapses that use the neurotransmitter γ-aminobutyric acid (GABA). Multiple types of GABA synapses are found in CA3 pyramidal cells (Miles et 1996; Scanziani, 2000). GABA<sub>A</sub> al., synapses are permeable to Cl<sup>-</sup> while GABA<sub>B</sub> synapses are coupled via G-protein interactions with K<sup>+</sup> permeable channels.

GABA<sub>A</sub> synapses at the soma have relatively rapid rise and decay rates when responding to an afferent spike. A slow form of GABA<sub>A</sub> synapses has been found in distal dendrites of CA1 pyramidal cells (Banks, Li, and Pearce, 1998). In the current model, slow GABA<sub>A</sub> synapses are placed in distal regions of target cell dendrites concomitant with perforant path synapses. GABA<sub>A</sub> synapses at the soma are larger than those found in dendrites (Miles et al., 1996). This is represented in the target cell model by decreasing peak GABA<sub>A</sub> conductance

Table S8. GABAergic synapse model parameters

		<b>7</b> 1		1					
Synapse type	g <sub>max</sub>	V <sub>rev</sub>	ACh	ACh	$a_0$	$\tau_{ppfd}$	t <sub>delay</sub>	$\tau_{rising}$	$\tau_{ m decay}$
	(nS)	(mV)	А	Kd (µM)		(ms)	(ms)	(ms)	(ms)
GABA <sub>A,fast</sub>	0.2	-70	-0.8	3.3	-0.7	15	0.25	0.3	5.6
GABA <sub>A,slow</sub>	0.2	-70	-0.8	3.3	-0.7	15	0.25	5.0	40
GABA <sub>B</sub>	0.5 pS	-95	-0.8	3.3	3.7	33	20.0	70	110 (84%)
	-								516 (16%)

Abbreviations and symbols: peak conductance at the soma  $(g_{max})$ , reversal potential  $(V_{rev})$ , acetylcholine (ACh), maximum ACh effect (A), half-effect concentration (Kd), neurotransmitter release delay  $(t_{delay})$ , rising time constant  $(\tau_{rising})$ , falling time constant  $(\tau_{decay})$ . Note that  $g_{max}$  for GABA<sub>B</sub> receptors is a conductance change per afferent GABAergic spike and does not reflect the conductance of associated potassium channels. GABAergic synapse conductance is reduced by a factor of three in dendrites as compared with synapses at the soma.

values in dendrites by a factor of three compared with the corresponding value in the soma.

GABA<sub>B</sub> synaptic currents arise through a series of complex interactions. For the purposes of the current model, this is simplified by expressing the result of GABA<sub>B</sub> receptor activation with а combination of two dual-exponent responses (Otis, De Koninck, and Mody, 1993). The conductance value used in modeling GABA<sub>B</sub> receptors is scaled to correspond with the ratio of charge transfer between GABA<sub>A</sub> and GABA<sub>B</sub> receptor currents that arise in response to low-frequency afferent spikes (Scanziani, 2000). Slow initial **GABA**<sub>R</sub> activation of receptors is represented in the model as a delay between the arrival of GABAergic spikes and the time at which GABA<sub>B</sub> currents are detectable such that the time to peak response in the model closely approximately the time-to-peak for GABA<sub>B</sub> responses found by Otis et al. (1993) including the 10 ms overhead interval noted by Otis et al. as preceding the starting time in their plots of measured postsynaptic currents.

Both  $GABA_A$  and  $GABA_B$  synapses are affected by the frequency of the afferent spike train (Scanziani, 2000). GABAergic synapses are also affected presynaptically by ACh modulation (Seeger et al., 2004). This is reflected in the current model as the product of a paired-pulse effect and a muscarinic modulation effect as

$$q_{rel} = \left[ 1 + a_0 \exp\left(-\frac{t_{ISI}}{\tau_{ppfd}}\right) \right] \times \left[ 1 + \frac{A \cdot [ACh]}{[ACh] + Kd} \right]$$
(15)

where  $q_{rel}$  is the release quantity,  $a_0$  is the paired-pulse effect for immediately successive afferent spikes,  $t_{ISI}$  is the time between spikes, and  $\tau_{ppfd}$  is the time constant of the paired-pulse effect, [ACh] is the current extracellular ACh concentration, A = -0.8, and  $Kd = 64 \mu M$ . For  $GABA_A$ synapses,  $q_{rel}$  is interpreted in the model as the probability of neurotransmitter release. For GABA<sub>B</sub> synapses, in which the modeled response is more collective,  $q_{rel}$ is interpreted as a continuous value for scaling response magnitude. The value of  $a_0$  used in the model of GABA<sub>B</sub> synapses is positive to account for facilitation seen in higher frequency stimulations even though, for single spike pairings, GABA<sub>B</sub> synapses show paired-pulse depression (Otis et al., 1993; Scanziani, 2000).

**Spike-Timing Dependent Plasticity Model** Long-term synaptic plasticity is modeled based on spike-timing dependent plasticity (STDP) as described experimentally in CA3 pyramidal cells (Debanne et al., 1997; Bi



Figure S2. Schematic of model STDP synapse states. synapse is assumed to contain Each а phenomenological population of plasticity entities. Each plasticity entity has a discrete long-term state that influences plasticity expression. The relative AMPA receptor conductance in the synapse, the synaptic weight, exponentially approaches the total fraction of the plasticity population in states P and D with a time constant of 10 sec. Each long-term potentiation (LTP) or long-term depression (LTD) event causes a change of state with probabilities as indicated. Decay from state D to state N occurs with a time constant of 70 msec. Synapses are initially silent, with all plasticity entities in state N. This is figure also appears in the main body of the article and is included here for completeness.

and Poo, 1998). NMDAR-independent longterm plasticity is not addressed within the scope of the current model and thus mossy fiber plasticity is not addressed here.

While it would be desirable to model synaptic plasticity in purely mechanistic terms, accurate biophysical models of the underlying pathways remain elusive. A less detailed phenomenological approach to modeling plasticity is developed here by generalizing the plasticity rules proposed by Sjöstrom, Turrigiano, and Nelson (2001). In the current model, STDP is defined in terms of a Markov model of synaptic states (Figure S2). Separate detectors or pathways

are postulated for events that induce longterm potentiation (LTP) and long-term depression (LTD) as previously proposed (Karmarkar and Buonomano, 2001; Bender, Bender, Brasier, and Feldman, 2006). LTP is assumed to be induced whenever a sufficient number of NMDA receptors containing the NR2A subunit are briefly opened with a combination of glutamate binding and postsynaptic depolarization. Receptor time constants are adapted from experimental results (Flint et al., 1997), adjusted for recently discovered dependencies on the state of the Mg<sup>2+</sup> pore blocker (Kampa et al., 2004; Vargas-Caballero & Robinson, 2004), extrapolated and to physiological temperatures. The model of **STDP** incorporated in target cell AMPA receptor synapses uses parameters shown in Table S9.

 Table S9. STDP Model Parameters

Parameter	Symbol	Value
Maximum weight	W <sub>max</sub>	3.2
Weight adjust time constant	$ au_{ m W}$	10 sec
Voltage threshold for LTP	$V_{LTP}$	-30 mV
Voltage threshold for LTD	V <sub>LTD</sub>	-40 mV
Minimum postsynaptic ISI	t <sub>ISI</sub>	3 ms
NMDAR open probability	Ро	0.02
Rated temperature for Po	$T_{Po}$	25°
Q <sub>10</sub> for Po	Q <sub>10</sub>	1.8
Num. NMDAR in synapse	N <sub>NMDAR</sub>	400
Num. NMDAR for LTP	N <sub>LTP</sub>	5
Glu binding probability	P <sub>bind</sub>	0.6
Time for NMDAR to open	topen	10 ms
D-state decay time constant	$ au_{ m LTD}$	70 ms
Homosynaptic LTD prob.	P <sub>HLTD</sub>	0.06
LTD probability for $\Delta t=0$	$PO_{LTD}$	0.45
LTD prob. time constant	$ au_{ m PLTD}$	90 ms
LTP N-to-P transition prob.	$k_{LTP}$	0.012
LTD P-to-D transition prob.	$k_{LTD}$	0.012
LTP D-to-P transition prob.	$k_{FDP}$	1.0
Ca <sup>2+</sup> NMDAR supp. amount	A <sub>CaSupp</sub>	0.3
$Ca^{2+}$ supp. time constant	$\tau_{CaSupp}$	90 ms

Abbreviations: long-term potentiation (LTP), longterm depression (LTD), NMDA receptor (NMDAR), inter-spike interval (ISI), probability of opening (Po), glutamate (Glu), probability (prob), suppression (supp).

The LTP component of the STDP timing curve is established by harmonizing the results that Debanne et al. (1997) measured at 32° with the results obtained by Bi and Poo (1998) at room temperature (nominally 25°). LTD inducing events are determined by the relative timing of pre-and postsynaptic spikes as found by Debanne et al. (1997). As found experimentally, LTP inducing events override immediately preceding LTD events (Sjöstrom et al., 2001; Wang et al., 2005). A form of shortterm calcium suppression of NMDA receptors is included in the model because of the extra sensitivity to intracellular calcium found in CA3 NMDA receptor currents (Grishin et al., 2004) and because of the correlation between such sensitivity and the increased temporal window for LTD induction (Froemke, Poo, and Dan 2005) such as found in CA3 pyramidal cells (Debanne et al., 1997). Expression of synaptic plasticity is assumed to occur at a fixed rate, which, while not tightly constrained by experimental data, provides a delay between plasticity inducing events and the full expression of plasticity in the synapse. It should be emphasized that the model of synaptic plasticity used here is entirely phenomenological and aims only to approximate mean values of changes to AMPA receptor currents induced by synaptic plasticity.

Detection of LTP events involves an estimate of the number of concurrently open at а time NMDA receptors when membrane potentials postsynaptic are sufficiently depolarized to remove the Mg<sup>2+</sup> pore blocker in the NMDA receptor and permit the influx of calcium ions. A simplified model of the synapse is used to make this estimate. A fixed number of NMDA receptors is assumed to be present in the synapse (N<sub>NMDAR</sub>) of which a fixed proportion of those not current bound are assumed to bind to glutamate (P<sub>bind</sub>)

following each neurotransmitter release event. Glutamate unbinding is assumed to occur at the same rate as NMDA receptor currents in the synaptic model.

LTP events are detected when the postsynaptic membrane potential at the synapse exceeds a voltage threshold ( $V_{LTP}$ ). The probability of an LTP event in this case is estimated in the current model as

$$A_{AChCa} = 1 - \frac{1 - A_{CaSupp}}{1 + A_{ACh} \frac{[ACh]}{[ACh] + Kd}},$$

$$n = N_{glu} \cdot P_o \cdot Q_{10}^{(T-T_{Po})/10} \times \left(1 + A_{ACh} \frac{[ACh]}{[ACh] + Kd}\right) \qquad (16)$$

$$\times \left(1 - A_{AChCa} \exp\left(-\frac{\Delta t}{\tau_{CaSupp}}\right)\right),$$

$$P_{LTP} = \frac{n^4}{n^4 + N_{LTP}^4}$$

where n is the expected number of open NMDA receptors,  $N_{glu}$  is the expected number of bound receptors, T is the temperature,  $A_{ACh}$  and Kd are the NMDAR ACh modulation parameters described above,  $\Delta t$  is the time since the previous postsynaptic spike event,  $P_{LTP}$  is the estimated probability of an LTP event, and other symbols are as shown in Table S9. Parameters for Ca<sup>2+</sup>-dependent suppression of NMDA receptors are derived by fitting data reported by Froemke, Poo, and Dan (2005).  $A_{AChCa}$  combines the effects of ACh modulation and Ca<sup>2+</sup>-dependent suppression on the assumption that an effect of ACh is to increase the sensitivity of changes to intracellular calcium without changing the of Ca<sup>2+</sup>-dependent effect maximum suppression when  $\Delta t$  approaches zero. Other parameters are derived from published estimates except for  $Q_{10}$  which has been chosen to reconcile STDP results measured

at different temperatures. The  $Q_{10}$  value used in equation (16) therefore does not necessarily correspond with the temperature dependence found in NMDA receptor currents.

The probability of LTD inducing events is purely phenomenological without any assumption as to the mechanisms involved. For a given presynaptic spike, let  $\Delta t$  be the time between the spike arrival and the most recent time at which postsynaptic membrane potentials exceeded the LTD threshold (V<sub>LTD</sub>). The probability of an LTD inducing event for the presynaptic spike is then estimated as

$$P_{LTD} = P_{HLTD} + (P0_{LTD} - P_{HLTD}) \cdot \exp\left(-\frac{\Delta t}{\tau_{PLTD}}\right)$$
(17)

where  $P_{LTD}$  is the LTD inducing event probability and parameters are as described in Table S9.

A surprising result reported by Debanne et al. (1997) is that simultaneous pairing of presynaptic and postsynaptic spikes in CA3 pyramidal cells leads to LTD rather than LTP. Debanne et al. offered as an explanation their observation that NMDA receptor currents develop slowly and do not peak until well after the presynaptic spike. For purposes of the current model, during the time interval immediately following a presynaptic spike, both LTP and LTD events are assumed to be possible (Bender et al., 2006). The number of open NMDA receptors is assume to increase linearly over time during the interval in which LTP and overlap, resulting in increasing LTD probabilities of LTP induction. The probability of an LTD inducing event in the overlap interval is estimated as

$$P_{LTD} = \left(P0_{LTD} - P_{HLTD}\right) \cdot \left(1 - \frac{\Delta t}{t_{open}}\right)$$
(18)

where  $P_{LTD}$  is the probability of an LTD inducing event,  $\Delta t < t_{open}$  is the time between the previous presynaptic spike and the time at which the postsynaptic membrane potential threshold was subsequently exceeded, and  $t_{open}$  is as described in Table S9. If  $\Delta t$  is not less than  $t_{open}$  then  $P_{LTD}$  is zero. Note that the preceding presynpatic spike is subject to homosynaptic LTD, which is treated as a separate LTD-inducing event in the model.

Evolution of the Markov state model is as shown in Figure S2. For a given synapse, let N, P, and D be the fraction of the plasticity entity population in the respective states and let W be the current synaptic weight for AMPA receptors in the synapse. The model of synaptic plasticity then evolves according to

$$\frac{dN}{dt} = -k_{LTP}N \cdot P_{LTP}\delta_{LTP}(t) + D/\tau_{LTD},$$

$$\frac{dP}{dt} = (k_{LTP}N + k_{FDP}D) \cdot P_{LTP}\delta_{LTP}(t)$$

$$- k_{LTD}P \cdot P_{LTD}\delta_{LTD}(t),$$

$$\frac{dD}{dt} = k_{LTD}P \cdot P_{LTD}\delta_{LTD}(t) - D/\tau_{LTD}$$

$$- k_{FDP}D \cdot P_{LTP}\delta_{LTP}(t),$$

$$\frac{dW}{dt} = [W_{max} \cdot (P + D) - W]/\tau_{W}$$
(19)

where  $\delta_{LTP}(t)$  and  $\delta_{LTD}(t)$  have a unit impulse/sec value when LTP or LTD events potentially occur at time *t* and are zero otherwise. The probabilities of LTP and LTD event occurrence in any instance are  $P_{LTP}$  and  $P_{LTD}$  as described above. To reduce the burden of continuously updating the state of every synapse, a computational simplification is used in which synaptic weights for each synapse are only updated once per model time step, that is, once per simulated millisecond. Note that the current model only attempts to estimate the expected synaptic weight and does not take into account the variability that would result if underlying pathways have stochastic properties.

Huang et al. (2005) have recently shown that GABA<sub>B</sub> receptor currents are also affected by the same pathway as AMPA-NMDA receptor LTP. While this phenomenon is completely not as characterized as STDP, it plays a potentially significant role in network stability. The following simplified representation of the phenomenon is adopted in the current model.

Plasticity induced changes in AMPA receptor conductance in a synapse are assumed to be mapped to the GABA<sub>B</sub> associated conductance in a time delayed fashion. Let  $W_{AMPA}$  be the synaptic weight for AMPA receptors in a synapse. The plasticity modulated GABA<sub>B</sub> conductance associated with an AMPA-NMDA receptor synapse is governed by

$$\frac{dg}{dt} = \frac{\left(1 + \rho W_{AMPA}\right)g_0 - g}{\tau}$$
(20)

where g is the portion of GABA<sub>B</sub> conductance associated with the AMPA-NMDA receptor,  $g_0$  is the proportional GABA<sub>B</sub> conductance when AMPA receptor weights are zero, p is a constant reflecting the relative coupling between AMPA and GABA<sub>B</sub> receptor weight changes, and  $\tau$  is the time constant with which GABA<sub>B</sub> conductance changes are expressed. For the current model, parameters used are  $\rho=4$  and  $\tau$ =60 sec, though neither value is tightly constrained by available experimental data. The value of  $g_0$  is derived based on the total conductance for GABA<sub>B</sub> synapses for a compartment divided by the number of AMPA-NMDA receptor synapses associated with the same compartment.

# **Target Cell Model Results**

While CA3 pyramidal cells have been less

extensively studied than CA1 pyramidal cells, key experimental results were used to constrain the target cell compartmental model. Passive cell properties in the model were evaluated using current injection protocols consistent with the experimental methods of Spruston and Johnston (1992). Results are shown in Figure S3. The currentvoltage relationship for a minimal current injection (-10 pA) at the soma corresponded with a whole cell input resistance of 93.5 M $\Omega$  when [ACh] = 0  $\mu$ M and 87.5 M $\Omega$ when  $[ACh] = 100 \ \mu M$  (data not shown). Resting potentials at the soma were -69.2 mV and -65.4 mV for [ACh] = 0 and 100 µM, respectively. Because time constants for the Ih current are voltage sensitive, a single passive time constant could be misleading. Fitting voltages changes occurring shortly after the onset of current injection (+0, +5 and +10 ms) to an exponential decay yielded passive time constants of 40 ms and 35 ms for [ACh] = 0and 100 µM, respectively. A brain temperature of 37° is assumed for the current simulations. As a consequence, resistances would be expected to be somewhat lower and time constants to be faster than corresponding values found by Spruston and Johnston for CA3 pyramidal cells at 32° (Thompson, Masukawa, and Prince, 1985).

A hallmark of CA3 pyramidal cell behavior is the generation of a characteristic bursting pattern (Wong & Prince, 1981). While the objective of the current model is the simulation of cell activity during a theta rhythm state in which ACh concentrations are elevated, reproducing a CA3 pyramidal cell burst with no ACh present is a sensitive test of the ion channel properties assumed in the model. Figure S4A shows a typical burst generated when a brief current injection is applied at the target cell soma compared with the single spike that is generated in response to the same stimulation when ACh



Figure S3. Measurement of simulated target cell passive properties by somatic current injection. **A.** Whole cell I-V relationship using injections of -100, -50, -30, -20, -10, 10, and 20 pA with [ACh]=0. **B.** Somatic voltage traces. The trace associated with 30 pA current injection is truncated because of spikes generated. The simulated temperature is 37 °C.

is assumed to be present. In the absence of inhibition, action potentials originating in the target cell axon and soma readily backpropagate throughout all dendrites, though with some diminution of amplitude in the more distal locations, as shown in Figure S4B. Throughout the cell, the amplitude of backpropagating action potentials was sufficient to trigger synaptic plasticity changes if paired with presynaptic activity.

The target cell model was modeled with active dendrites. Hence, propagation of synaptic currents from dendrite locations to the soma was potentially non-linear, a factor that could have affected integration of synaptic inputs.

Figure S5 compares excitatory postsynaptic potentials (EPSP) at the soma resulting from glutamatergic synapse stimulation at two different locations. The first synapse was located on a medium-sized ( $0.4 \mu m$  radius) apical dendrite located 250  $\mu m$  from the soma and the second was a similar synapse on a thinner ( $0.24 \mu m$ radius) distal dendrite located 550  $\mu m$  from the soma. While the distal synapse response



Figure S4. Simulated target cell responses to a 5 ms somatic current injection of 1 nA following a one second settling interval. A. Somatic response showing a characteristic burst response when [ACh]=0 single spike μM and а when [ACh]=100 µM. B. Peak dendrite membrane potentials resulting from backpropagating action potentials for [ACh]=100 µM. Peak potentials for [ACh]=0 µM are similar to values shown. Negative path distances refer to basal dendrites.



Figure S5. Simulated responses to glutamatergic synapse stimulation in the target cell. Synapses contain AMPA and NR2A receptors with peak conductance values of 1 nS and 0.2 nS, respectively. **A.** Somatic EPSP response to stimulation of an associational connection synapse located on a medium-sized apical dendrite trunk and to stimulation of a perforant path synapse on a thin distal dendrite. **B.** Peak voltage response to perforant path synapse stimulation. Only responses in apical locations are shown.

showed attenuation at the soma, EPSPs of the two synapses are similar. Peak voltage changes in the dendrites were, however, very dissimilar. The more proximal synapse experienced a peak dendrite depolarization of approximately 5 mV (data not shown) while the distal synapse dendrite depolarization was 56 mV and assumed the form of a local dendritic spike. Even though no action potentials were generated in either case, depolarization of the distal dendrite would have been sufficient to affect NMDA

receptors and induce changes via synaptic plasticity. When sodium channels were suppressed in the target cell model, peak somatic EPSP from distal dendrite synaptic stimulation was reduced by 36% (data not shown) and peak dendritic depolarization was reduced to 27 mV with no evidence of a dendritic spike.

### **Synaptic Plasticity Results**

Two forms of synaptic plasticity are included in the current model. Short-term plasticity affects the probability of neurotransmitter release or, in the case of mossy fiber synapses, the expected quantity of release. Long-term plasticity affects the weight multiplier of AMPA receptor conductance in the synapse.

Figures S6A and S6B compare shortterm plasticity in AC and MF glutamatergic synapses. Because ACh affects release in AC synapses, a medium concentration of ACh is assumed in illustrating the effects of short-term plasticity in these synapses. Short-term plasticity in AC synapses was modeled as similar to the model proposed by Dittman et al. (2000) for CA1 Schaffer collateral synapses. The MF short-term model was constrained plasticity bv measurements of paired-pulse facilitation for successive spikes and maximum facilitation in a train of spikes (Salin et al., 1996). Frequency dependencies of MF synapse responses have not been completely characterized experimentally, but the current model is consistent with the observation that multiple DG granule cell spikes in rapid succession are needed to produce the quantity of neurotransmitter release required to generate an action potential in a CA3 pyramidal cell (Henze, Wittner, and Buzsáki, 2002).

Figure S6C shows the effect of spike timing in the STDP model of CA3 long-term plasticity for single spike pairings. This is experimentally comparable with



Figure S6. Simulated glutamatergic synaptic plasticity. Results shown are for a simulated temperature of  $37^{\circ}$  and  $[ACh] = 20 \ \mu$ M. A. Mean neurotransmitter release quantity for each spike in a 20 Hz spike train for mossy fiber (MF) synapses and CA3 associational connection (AC) synapses. Note different scales for each synapse type. AC neurotransmitter release occurs as a single quantile with probabilities as indicated. **B**. Mean release quantity relative to the release rate of the first spike at different frequencies. Value shown is mean release quantity for the tenth spike. **C**. Spike-timing dependent plasticity (STDP) long-term EPSC changes for AC synaptic AMPA receptors. Synaptic weights are set to unity at the start of the simulation and neurotransmitter release probability is set to one throughout. Relative EPSC values are measured via synaptic weights following 60 pre- and postsynaptic spike pairings at one second intervals with an additional 30 second delay after the last spike pairing. Positive time differences correspond with pre- before post spike pairings. **D**. The effect of spike train frequency on synaptic plasticity. Sets of five pre- and postsynaptic spike trains at the frequencies indicated are paired twenty times at three-second intervals. Spike time differences reflect the relative timing of the initial pre- and postsynaptic spikes in each set of five spikes.

experimental results of Debanne et al. (1995) in CA3 pyramidal cells and is similar to results of by Sjöström et al. (2001) for visual cortex L5 pyramidal cells. The initial synaptic weight for these tests was assumed to be one. In general, smaller initial synaptic weights would result in larger relative changes in synaptic weights for LTP spike pairings and should not affect relative changes for LTD pairings.

As found by Sjöström et al. (2001), STDP is dependent upon spike rate as well as timing. Figure S6D shows the affect of multiple pairings of spike trains that have different frequencies. At higher frequencies, LTP dominates over LTD even when postsynaptic spikes precede presynaptic spikes. While, these frequencies are generally in excess of the CA3 pyramidal cell place cell firing rates, they can easily be attained during short bursts.

The effects of ACh on STDP have not been characterized experimentally. The simulations shown in Figure S6 were performed assuming [ACh] = 20  $\mu$ M, a value sufficiently large to exceed the threshold for muscarinic receptor activation but less than the peak values found during locomotion.

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