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#### Introduction

Visual information enters the cerebral cortex through thalamocortical connections, partly on the basis of synchronized neuronal firing.

#### How many synchronous synapses are necessary for reliable thalamocortical transmission to occur?

Difficult to quantify experimentally: Would require the simultaneous monitoring of many synaptic inputs.

We used a biophysical multi-compartment model of a layer 4 cortical spiny stellate cell contacted by stochastic synapses exhibiting short term dynamics.

We used simultaneous recordings from LGN and V1 obtained in anesthetized cats during visual stimulation with drifting gratings<sup>1</sup>.

The model synapses were stimulated with the experimental LGN data and the output of the model cell was compared to the experimental V1 recordings.

We used the reliability of firing patterns as a measure of

Found that thalamic inputs operate in a regime of around 20-40 synapses that optimizes efficient information transfer by synchronous population coding.

#### Methods



Multi-compartment (744) model of V1 spiny stellate cell (SC) with feedforward inhibition (model basket cell)

Separate LGN inputs and excitatory and inhibitory cortical synapses.

Dynamic synapses with low initial probability of release (0.2) endowed with short term facilitation and depression dynamics.



Input spike trains were taken from experimental recordings of Kara et al. with added jitter and noise. We used recent anatomical data<sup>3</sup> to estimate LGN convergence.

200 repeated trials with identical drifting pattern inputs to establish reliable statistics.

Developed new analysis tools to assess model output, and compared the model outputs with recorded data to derive the number of synchronous LGN synapses required for efficient





inhibition.

(B) Firing rate response. Synchrony Magnitude (OSM) is maximum RPSM. rate)

Standard deviation bars from 10 data points using 30 independent trials each.



SC response with 1 ms jitter and 200 synapse feed forward

- (A) Average spike-time reliability.
- (C) Reliability per synchrony magnitude (RPSM). Optimum
- (D) Reliability-per-spike (RPS) efficiency (reliability/firing

experimental data



![](_page_0_Figure_35.jpeg)

## Reliable Transmission of Visual Inputs into Cortex Depends on Thalamic Synchrony Jean-Marc Fellous<sup>3</sup> and Terrence J. Sejnowski<sup>1,2</sup>

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(A-C) Rastergrams of all 300 thalamocortical synaptic inputs into the model cell for one trial for synchrony magnitude 30, 80 and 200 respectively. Input spike train from in vivo LGN recordings was du-

![](_page_0_Picture_46.jpeg)

![](_page_0_Picture_47.jpeg)

849.1

#### Conclusions

Firing pattern reliability in V1 simple cells is a highly non-linear function of thalamic synchrony magnitude

Reliable cortical response begins at about 20 synchronous synapses, with a temporal integration window of less than 5 ms

An optimal synchrony magnitude (OSM) is achieved for about 30 synapses to match the data of Kara et. al.

Spike count variability (Fano Factor) is low: 0.2-0.4 if 20-80 synchronous input synapses are used

OSM depends on the balance between cortical excitatory and inhibitory background inputs.

Feedforward inhibition gradually increases OSM and decreases reliability

In vivo recordings (4 animals) predict OSM in the range of 20-60 synapses

As few as 6-10 dLGN cells may be effective at driving a V1 simple cell and at transmitting temporal spike information reliably.

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### Acknowledgements

The authors are indebted to Prakash Kara and R. Clay Reid for sharing in vivo recordings of simultaneously recorded retinal, thalamic and cortical neurons. Kevan Martin provided invaluable anatomical data on thalamocortical connectivity. The authors wish to thank Steven Prescott, Paul Tiesinga, Andrea Hausenstaub, and David Eagleman for helpful discussions. This study was funded through NSF and the HHMI

' Rel = 0.42 ' FR = 11.2 spk/s

50 100 150 200 25 Time (msec)

# Learning to give up! The contribution of the dopaminergic system to extinction

## INTRODUCTION

- The rate of extinction learning depends on the probability of getting the reward [1].
- neural substrate that could account for this The potential phenomenon is the ventral tegmental area (VTA) of the midbrain. Prior studies have shown that dopamine neurons in the VTA are involved in coding values of rewards with different probabilities, expectation of rewards, and reward related motivation [2,3].
- We hypothesize that VTA may play a role in this probability-dependent "resistance to extinction" phenomenon.

## METHODS

### **Behavioral experiment**

|      | Training session    |                   |         | Extinction                                      | (            |
|------|---------------------|-------------------|---------|---|--------------|
|      | Trial #<br>constant | Pellet # constant |         | session   |              |
| 25%  | 20                  | 80                | No time | Until the rat                                   | Same         |
| 50%  | 20                  | 40                | gap     | makes no<br>attempt for 7<br>consecutive trials | Food Pellets |
| 75%  | 20                  | 27                |         |   |              |
| 100% | 20                  | 20                |         |   |              |

### **Modulation of VTA dopamine neural activity**

| Day | saline |        | bupivacaine<br>or WIN-2 |  |
|-----|--------|--------|-------------------------|--|
| 1   | 100%   |        | 50%                     |  |
| 2   | 75%    | 1 hour | 25%                     |  |
| 3   | 50%    |        | 100%                    |  |
| 4   | 25%    |        | 75%                     |  |

Bupivacaine (2.5%, 0.5µL), WIN-55212-2 mesylate (2.5%, 0.5µL) or saline (5µL) was injected into the bilateral VTA just before the experiment.

### High density electrophysiology

Each rat was implated a hyperdrive consisting of 12 independently movable tetrodes. We recorded neuronal activity in the VTA in awake and freely moving animals.

![](_page_1_Picture_14.jpeg)

![](_page_1_Picture_15.jpeg)

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## RESULTS

### Rat behavior experiment gave consistent result with the human behavior study

![](_page_1_Figure_20.jpeg)

In trial number constant task, resistance to extinction was significantly different among different reward probabilities. (N = 12)

![](_page_1_Figure_22.jpeg)

Reconstructed from Lewis and Duncun (1958) [1].

![](_page_1_Figure_24.jpeg)

Bupivacaine significantly increased the general level of resistence to extinction (t-test; p < 0.05). In both experiment and control group, extinction resistence didn't meaningfully vary with different reward probabilities. (N = 5)

#### **Dopamine neuron whose activity reflect the level of** saliency was found.

![](_page_1_Figure_27.jpeg)

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#### **Probability dependent resistance to** extinction is not cognitive, but emotional

![](_page_1_Figure_30.jpeg)

![](_page_1_Figure_31.jpeg)

100%

No significant difference among different probabilities found in pellet number task (N = 9)

#### **Dopamine neuron activation decreased resistance** to extinction but preserved the effect of probability

![](_page_1_Figure_35.jpeg)

WIN-2 significantly decreased the general level of resistence to extinction (t-test; p < 0.05). In both experiment and control group, extinction resistence wasn't meaningfully different with different reward probabilities. (N = 2)

## CONCLUSIONS

## ACKNOWLEDGEMENT

This study was funded by HHMI Grant 52005889, Consejo Nacional de Ciencia y Tecnologia (CONACYT) and PEW Latin American Fellows Program in the Biomedical Science Grant #2005-000159.

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![](_page_2_Figure_0.jpeg)

![](_page_2_Figure_1.jpeg)

![](_page_2_Figure_2.jpeg)