## Modeling

pre-attentive stereo grouping by intracortical interactions in early visual cortex.

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Purpose: to see if intracortical interactions can account for some stereo grouping phenomana in physiology and psychophysics

## Stereo Grouping Phenomena modelled here:

- Enhanced V2 responses to stereo edges. (von der Heydt et al, 2000).
- Disparity capture (wall-paper effects) manifested by V2 responses (Bakin et al, 2000).
- Pop-out of a target of a unique depth from distractors of a different depth.
- Transparency.


## The stereo matching problem Example: the wall-paper effect



## The visual input samples both the true and the false matches

V1 neurons respond to both the true and false matches. (Cumming and Parker, 2000)

## But the cortex has to compute the true matches only

V2 neurons respond to only the true matches in the wall-paper effect (Bakin, Nakayama, and Gilbert, 2000 observed that a V2 neuron's response is tuned to the disparity value outside its receptive field, at the boundary of the depth plane (of the wall-paper-like grating. ).

## The stereo segmentation (grouping) problem

Detecting or highlighting discontinuities in depth, or depth edges, can serve segmentation, e.g., to segment two nearby planes of different depth, or to detect a target of a different depth - pop-out. Von der Heydt, Zhou, and Friedman, (2000) observed that V2 cells respond more vigorously when their receptive fields are near a depth edge.

Transparency: perceptually segregating two superimposed depth planes.

## The model

Cortical outputs to higher visual areas
higher responses at depth discontinuity outputs include mainly true matches only


Visual inputs, filtered through the disparity tuned RFs, to the excitatory cells. Inputs include both TRUE and FALSE matches between monocular inputs

## Model features and elements

- The model aims to emulate intracortical computations in V2.
- Each model unit is binocular and disparity tuned. The excitatory cells model cortical pyramidal cells. Each excitatory cell couples with a local interneuron to form a disparity tuned unit with a finite (small) size receptive field. Other input dimensions (e.g., orientation, color, motion) are omitted.
- Different cells are tuned to different depths, the receptive fields (RFs) of all model cells sample 3D visual space (2D frontol-parallel and 1D depth).
- Both true and false matches provide input to the model (pyramidal) cells.
- Long but finite range horizontal connections mediate monosynaptic excitation and disynaptic inhibtion between nearby pyramidal cells. Horizontal connections tend to link cells tuned to similar depth.
- Cells responding to the same monocular location but different depths inhibit each other.
- Horizontal connections mediate contextual influences such that, after initial transients, (1) the model cells respond significantly only to the true matches, and, (2) responses to depth discontinuities (depth edges or pop-out targets) are relatively higher.


## The model horizontal connection pattern

There are 3 components in the connections

## Near depth excitation Near depth inhibition Inter-depth suppression

Near depth excitation from the central cyan dot


Near depth inhibition from the central cyan dot


Inter-depth inhibition from the cyan dot


Model cells sample the visual space of 5 depth planes ( $5 \times 70 \times 403$-d locations).
Different depth planes are color coded
Each dot on a depth plane represents an RF center.
Dot size codes interaction (or response) strength

## The equations of motion:

$$
\begin{aligned}
& \dot{x}_{i d}=-\alpha_{x} x_{i d}-g_{y}\left(y_{i d}\right)+J_{o} g_{x}\left(x_{i d}\right)+\sum_{j, d^{\prime} \neq i, d} J_{i d, j d^{\prime}} g_{x}\left(x_{j d^{\prime}}\right)+I_{i d}+I_{o} \\
& \dot{y}_{i d}=-\alpha_{y} y_{i d}+g_{x}\left(x_{i d}\right)+\sum_{j, d^{\prime} \neq i, d} W_{i d, j d^{\prime}} g_{x}\left(x_{j d^{\prime}}\right)+I_{c}
\end{aligned}
$$

$x$ or $y$ : membrane potential for excitatory or inhibitory cells, $i, d$ index for frontal parallel location $i$ and depth $d, J, W$, horizontal connection matrix, $g$ sigmoid-like activation functions, $I_{i d}$ visual inputs, etc.

## Model computation illustrated by Popout



The scene consists of one depth plane and a single

Ione target dot at a different (blue) depth

## Input to the model

Input to cortex

contains true and false matches

## Evolution of activity with time

cortical activity at 0.60 membrane time constants

cortical activity at 6.00 membrane time constants

cortical activity at 1.40 membrane time constants

cortical activity at 12.80 membrane time constants


## After initial transients, time averaged model response

Time averaged cortex activity
contains mainly true matches
with higher responses to the lone target - popout and to the borders of the depth plane

## Model computation for Disparity Capture



## Input to the model

Input to cortex

contains true and
illusory depth planes
from true and
false matches

## After initial transients, time averaged model response

Time averaged cortex activity


Higher responses to the borders of the plane

Contextual influences enable disparity information at the boundaries to propagate into the center of the plane

## Model computation for Depth Discontinuity



## Input to the model

Input to cortex


## After initial transients, time averaged model response

Time averaged cortex activity


Higher responses to the depth discontunity and boundaries

## Model computation on Transparency



## Input to the model

Input to cortex


## After initial transients, time averaged model response

Time averaged cortex activity
Depth segregation


## Summary and Discussion

- Aim to capture both physiology and psychophysics of stereo grouping.
- Suggest contextual influences in early cortex play important roles.
- Relating to previous models: (1) Use cooperative algorithms like previous models (e.g., Marr and Poggio); (2) popout and depth edge highlights modelled for the first time; (3) more physiologically realistic mechanisms for transparency than previous models (e.g., Prazdny, 1985, Pollard et al 1985, Nishihara, 1987, Qian and Sejnowski, 1989, Marshall et al 1996).

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