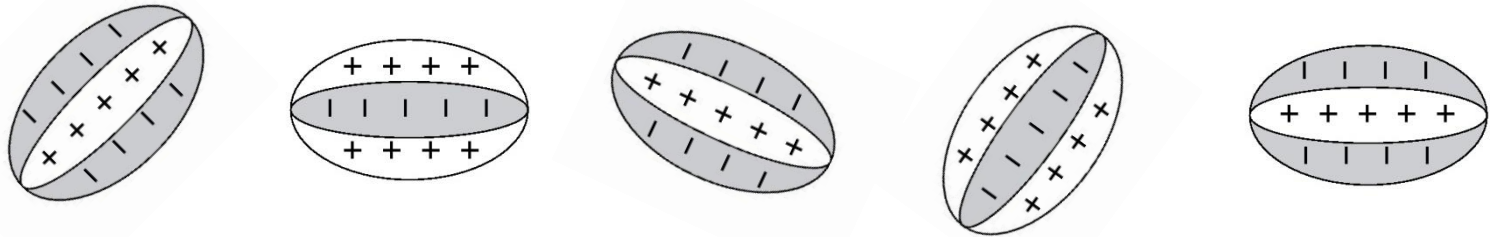


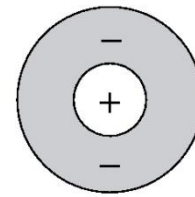
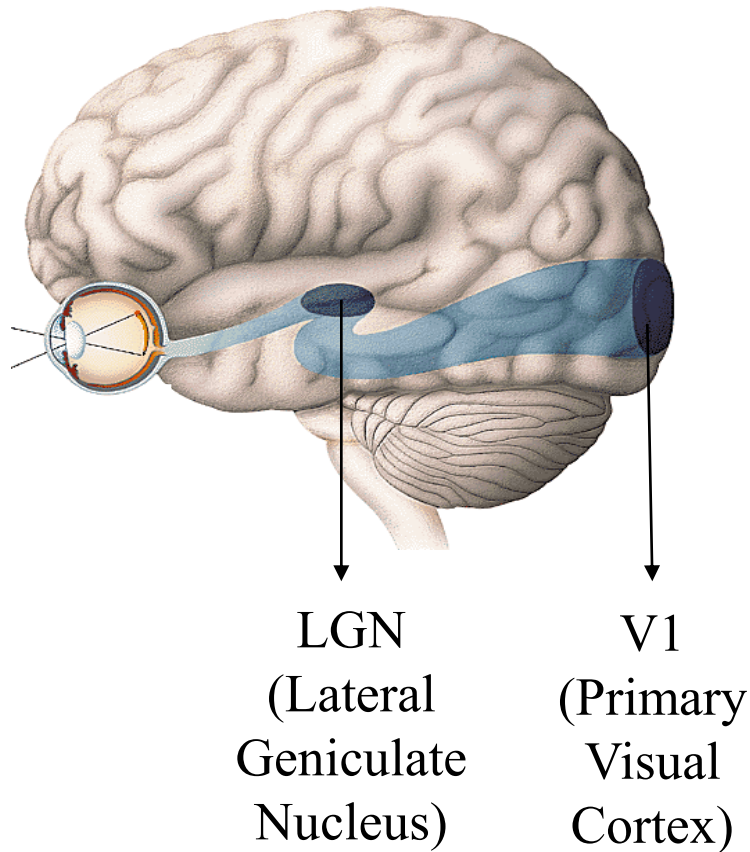
II. Mechanistic Model of Receptive Fields

♦ The Question: *How* are receptive fields constructed using the neural circuitry of the visual cortex?

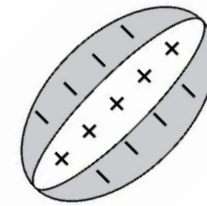


How are these *oriented* receptive fields obtained from *center-surround* receptive fields?

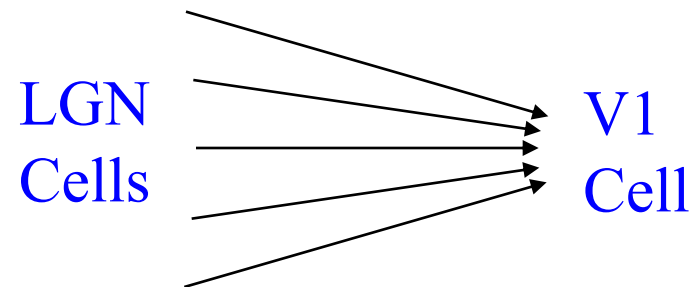
II. Mechanistic Model of Receptive Fields: V1



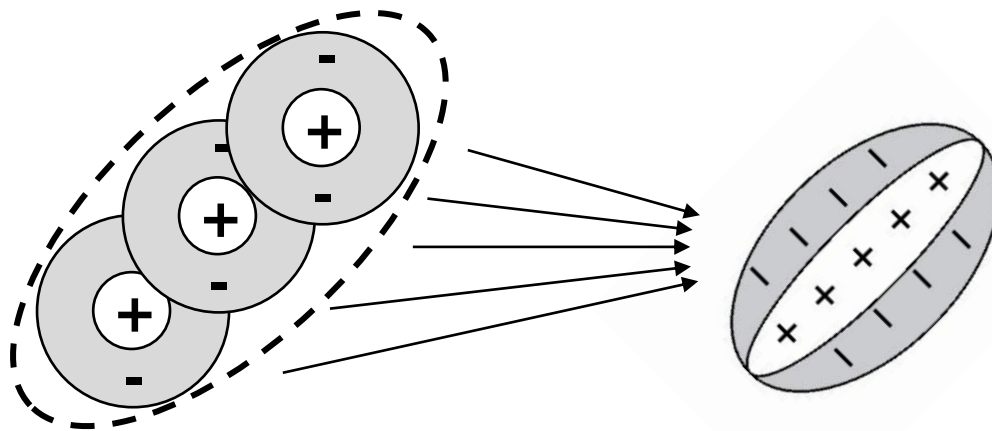
LGN RF



V1 RF



II. Mechanistic Model of Receptive Fields: V1



LGN Cells

V1 Cell

Model suggested by
Hubel & Wiesel in the
1960s: **V1 RFs are
created from converging
LGN inputs**

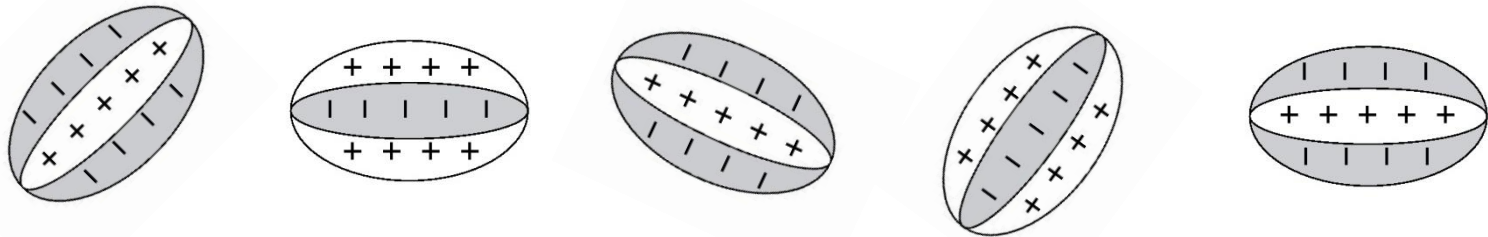
Center-surround LGN
RFs are *displaced along
preferred orientation* of
V1 cell

This simple model is still
controversial!

**controversial because it does not take
into account the (frequent) input from
recurrent connections it has with its
surrounding v1 cells, only the feed
forward inputs from LGN cells**

III. Interpretive Model of Receptive Fields

♦ **The Question:** *Why* are receptive fields in V1 shaped in this way?



What are the **computational advantages** of such receptive fields?

III. Interpretive Model of Receptive Fields

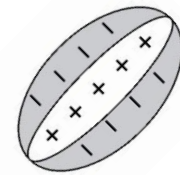
- ◆ **Efficient Coding Hypothesis**: Suppose the goal is to *represent images as faithfully and efficiently as possible* using neurons with receptive fields \mathbf{RF}_1 , \mathbf{RF}_2 , etc.

- ◆ Given image \mathbf{I} , we can **reconstruct** \mathbf{I} using neural responses r_1, r_2, \dots :

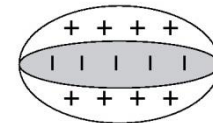
$$\hat{\mathbf{I}} = \sum_i \mathbf{RF}_i r_i$$

(r : some weight for RF)

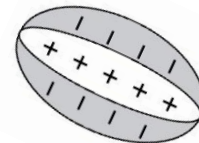
- ◆ **Idea**: What are the \mathbf{RF}_i that *minimize* the total squared pixelwise **errors** between \mathbf{I} and $\hat{\mathbf{I}}$ and are as *independent* as possible?



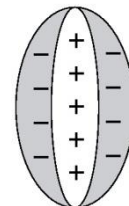
\mathbf{RF}_1



\mathbf{RF}_2



\mathbf{RF}_3



\mathbf{RF}_4

III. Interpretive Model of Receptive Fields

- ◆ Start out with **random \mathbf{RF}_i** and run your **efficient coding algorithm** on **natural image patches**

Natural Images



□ Receptive Field Size

ICA: independent component analysis

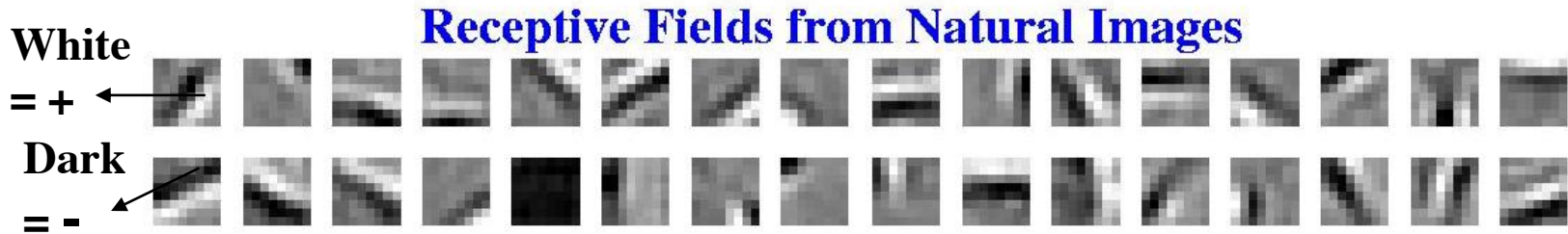
Sparse coding

ICA

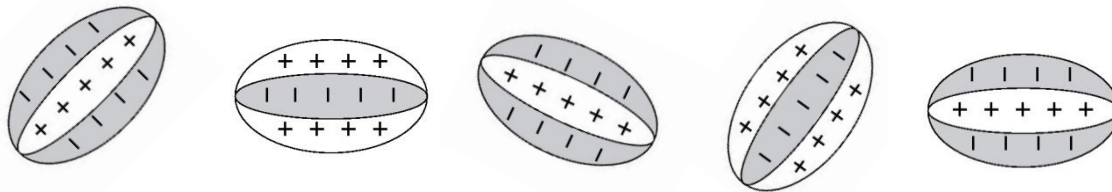
Predictive coding

(Olshausen & Field, 1996; Bell & Sejnowski, 1997; Rao & Ballard, 1999)

III. Interpretive Model of Receptive Fields



Receptive Fields in V1



Conclusion: The brain may be trying to find *faithful and efficient* representations of an animal's natural environment

We will explore a variety of *Descriptive*,
Mechanistic, and *Interpretive* models
throughout this course.

But before we do that...

Neurobiology 101:

Introduction to neurons, synapses, and brain regions

[Next Lecture]