## Review and Preview

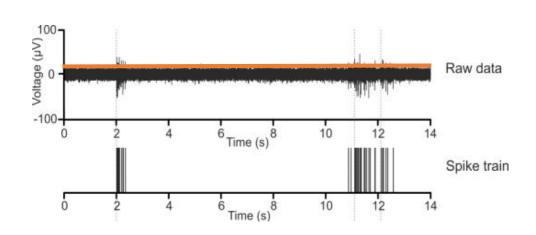
Daniela Pamplona

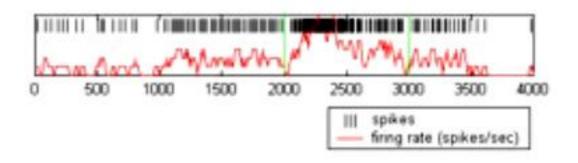
U2IS - ENSTA - IPParis

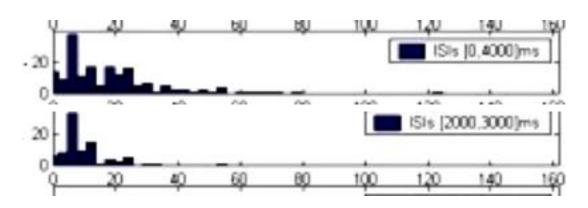
ecampus moodle: MI210 - Modèles neuro-computationnels de la vision (P4 - 2020-21)

daniela.pamplona@ensta.fr

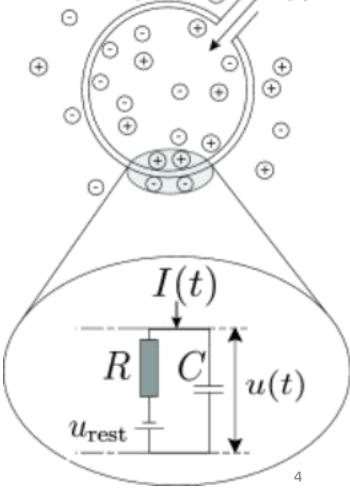
Date	Туре	Topic	Level of description	Methods
23/03	M + TD written and code	Intro to neuro, neurons, BNN and ANN	Implementational + Computational	Dynamical systems, Neural Networks
30/03	M + TD written	Probabilistic interpretation of visual processing	Computational	Probabilistic/ Bayesian Approaches
06/04	3 M(remote)	Vision and efficient coding	Computational + Algorithmic	Statistics
13/04	3 M (remote)	Receptive Fields, Retina and V1	Computational + Algorithmic	Unsupervised M.L.
27/04	3 TD (remote)	Applications to artificial vision	Computational + Algorithmic	Statistics +Unsupervised M.L.
04/05	M+TD written	Eye movements	Computational + Algorithmic	Reinforcement Learning
11/05	oral	General vision and brain	All	All above



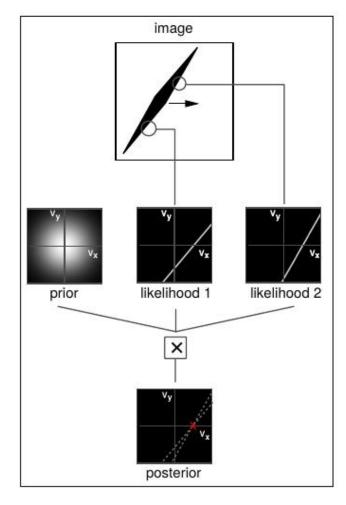


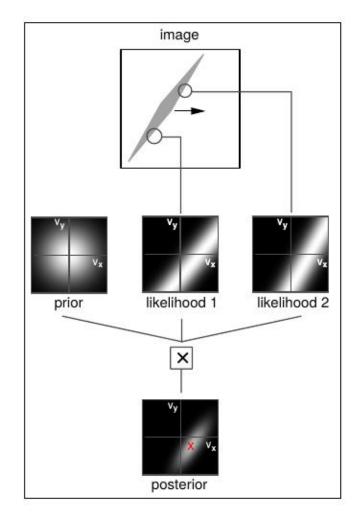


$$V(t) = \begin{cases} V_{rest} & \text{if } V(t) = v_{th} \\ V_{rest} - \tau \frac{dV}{dt} + RI(t) & \text{o.w.} \end{cases}$$

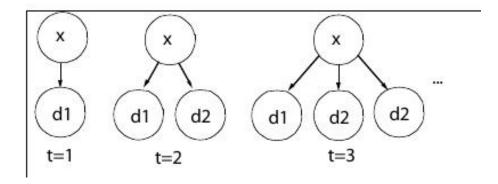


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- 1. The generative model
- 2. The inference process
- 3. The distribution of the MAP estimate



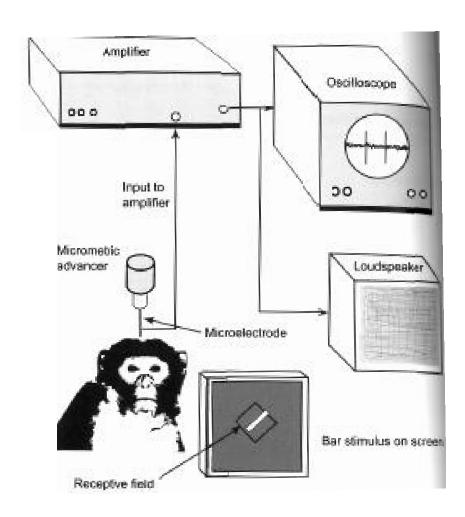
$$p(x \mid d_1 \cdots d_N) \propto p(x) \prod_{i=1}^N p(d_i \mid x)$$

The posterior at time N-1 is the prior at time N

$$= p(x)p(d_N|x)\prod_{i=1}^{N-1}p(d_i|x) \propto p(x|d_1\cdots d_{N-1})p(d_N|x)$$

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## Neural Recordings



#### 3.5 Single cell recording

The primate looks alert in the picture, and indeed fully conscious animals are sometimes used (the brain has no pain receptors). However, the animal is usually anaesthetized to achieve complete immobilization. This helps control accurately where the eyes are looking.

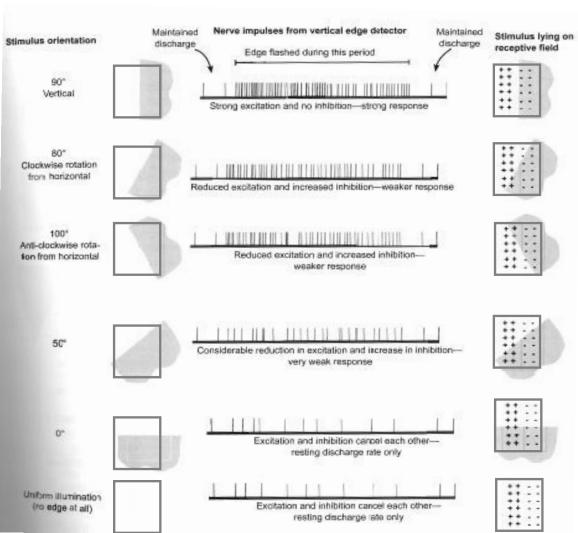
Seeing: The computaional Approach to Biological Vision

## Receptive Fields as Templates

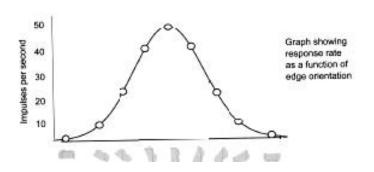
Receptive Field



Stimulus white is + black is -



#### **Tunning Curve**



#### Retina: structure

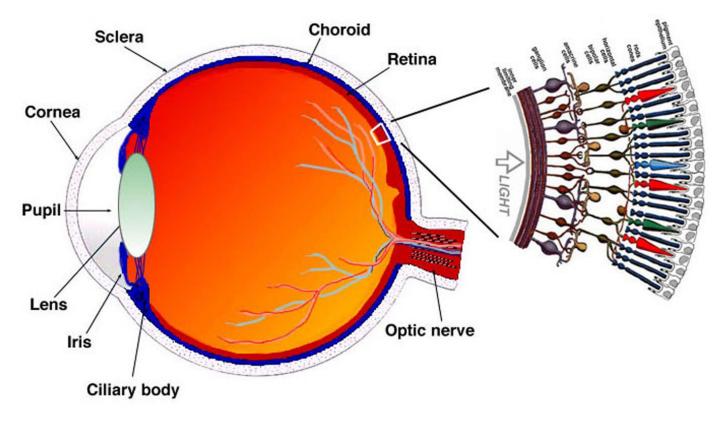
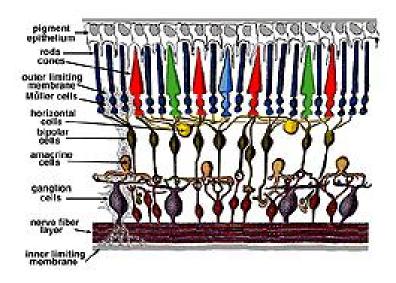
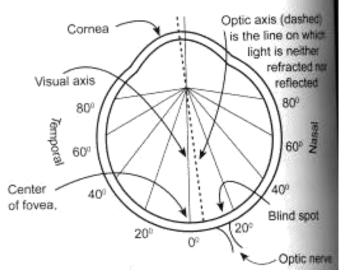


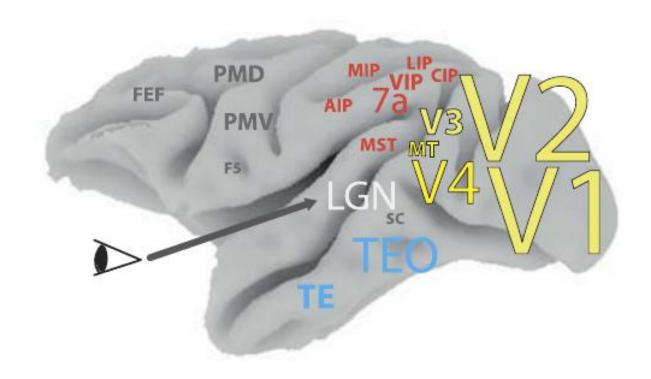
Fig. 1.1. A drawing of a section through the human eye with a schematic enlargement of the retina.



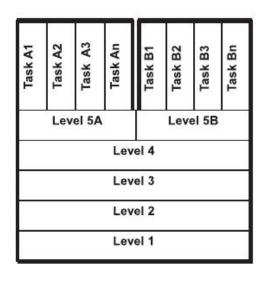


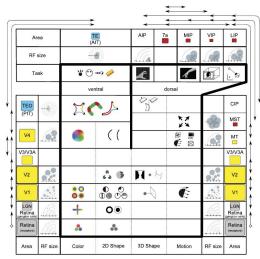
https://webvision.med.utah.edu

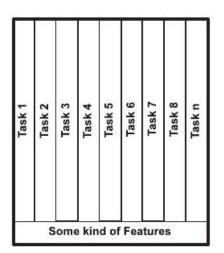
## Structure: What are the areas responsible for visual processing

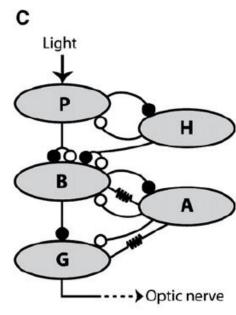


#### Hierarchical vs flat hierarchies

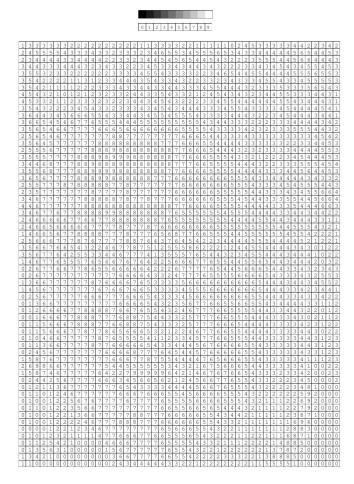






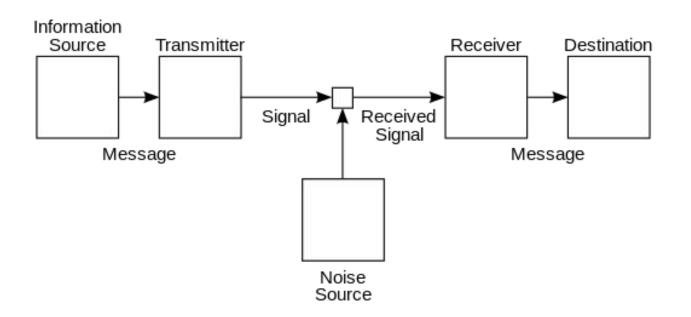


### What is in here?





## General Communication System



Example: Visual System

Information Source: Environment

<u>Transmitter</u>: Eye

**Channel:** Early visual system

Noise: Unknown

Receiver: Higher areas (MT,TE,MIP,...)

<u>Destination:</u> Other brain areas (PMC,..)

(ultimatly the environment)

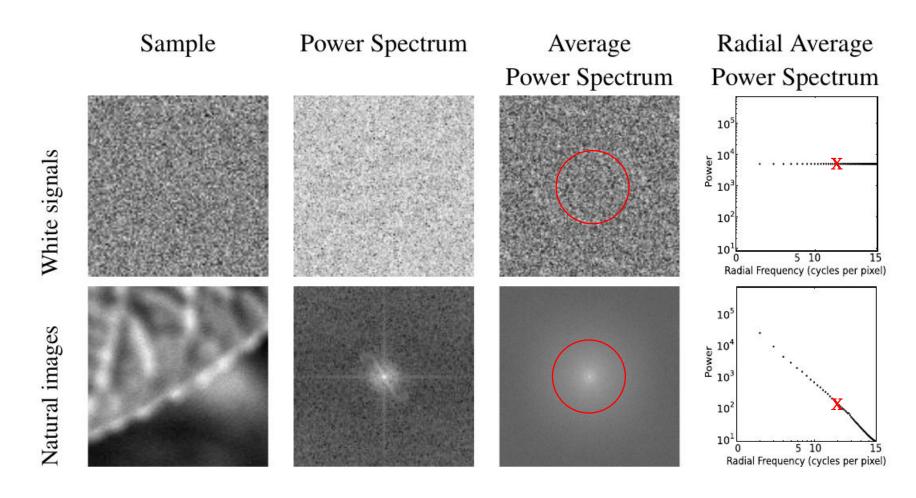
# What is the message? What are natural images?



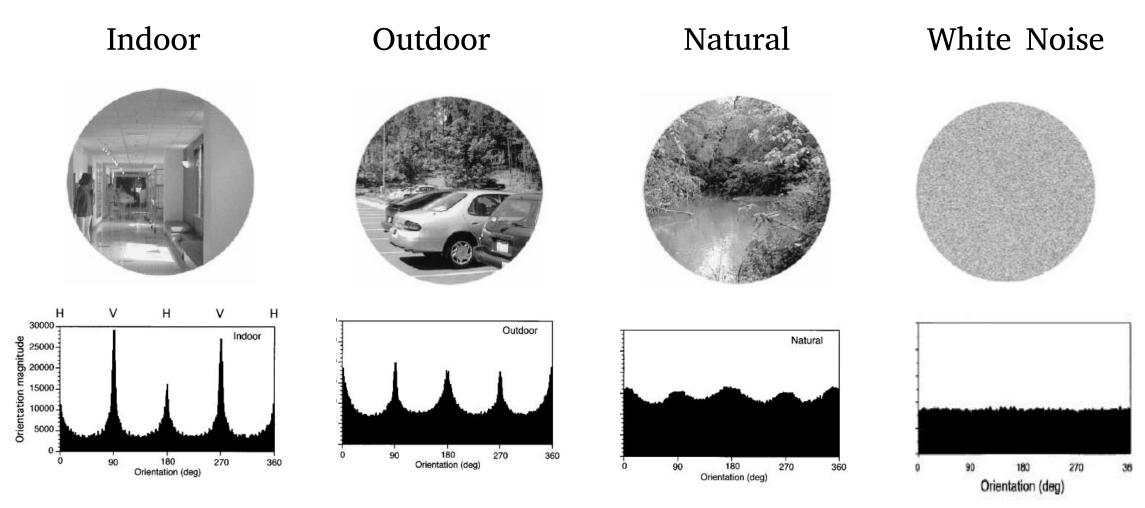
Non Natural

**Natural** 

## Power Spectrum of Natural Images



## Analysis of edges orientations



The distribution of oriented contoursin the real world, Coppola et al

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			Algorithmic	
11/05	oral	General vision and	All	All above
		brain		19

## Today

Retinal Ganglion Cells Modeling

 Modeling the Retinal Ganglion Cells RFs considering the eye's imaging

• V1 Simple Cells Modeling