



## Sensori-motor learning in the barrel cortex.

Laurent Bourdieu

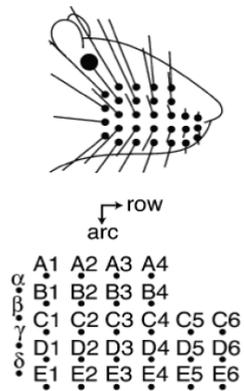
IBENS, Ecole Normale Supérieure,  
CNRS INSERM PSL University,  
46 rue d'Ulm 75005 Paris



# Outline

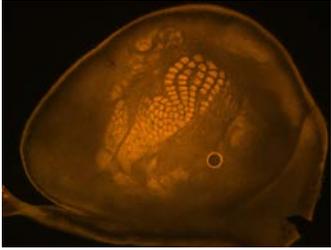
- **Introduction**
  - The rodent whisker system
  - Sensory maps
- **I) Unsupervised learning leads to the late emergence of the direction selectivity map in the barrel cortex**
- **II) Superposition of functional maps in the barrel cortex**
- **III) Reinforcement learning of an active tactile task**
- **Conclusion**

# Introduction

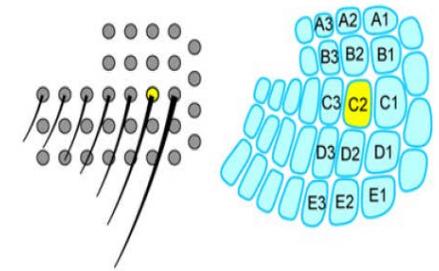
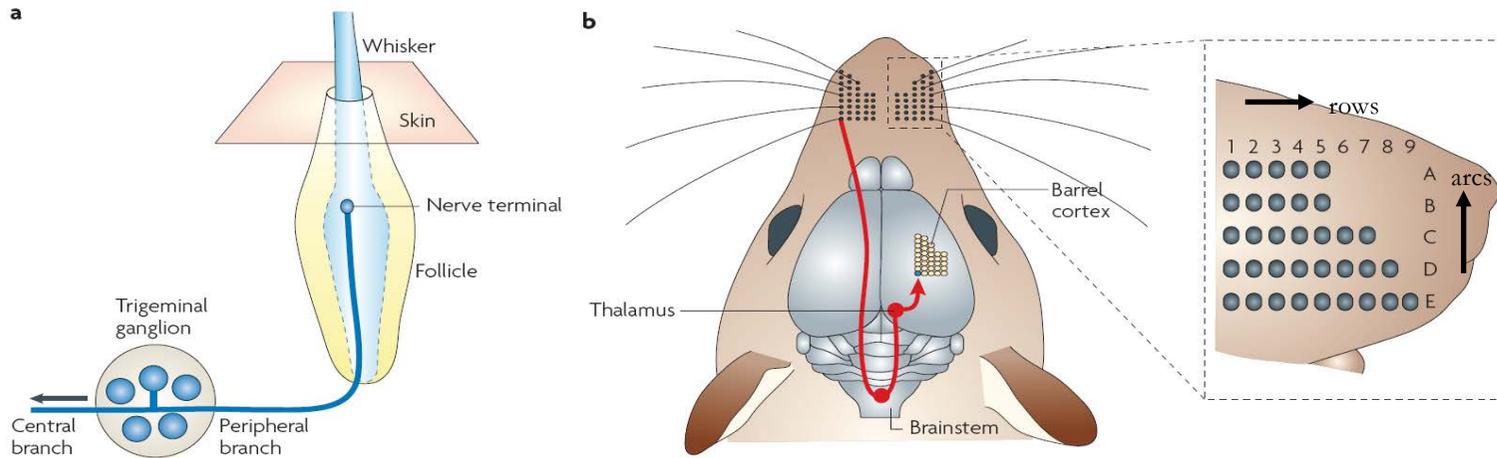


- Localization of objects (in the dark) : **WHERE**

- Information about object shape, size and surface texture: **WHAT**



# From whiskers to the somatosensory cortex



C. Petersen, Neuron 2007

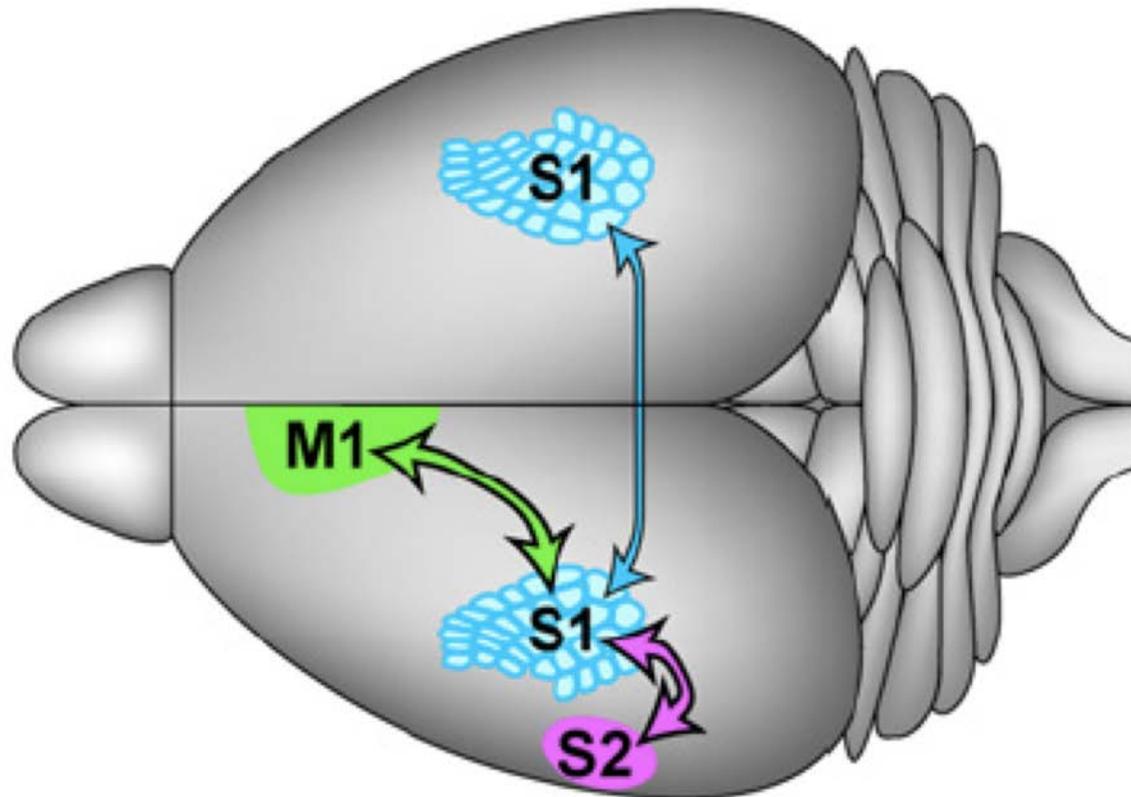
M. Diamond, Nature Rev. Neurosc. 2008

Dominant paradigm for whisker processing of tactile information :

- Whiskers have discrete cortical representations
- Barrels are anatomically and functionally independent

From whiskers to the somatosensory cortex

## Corticocortical connectivity



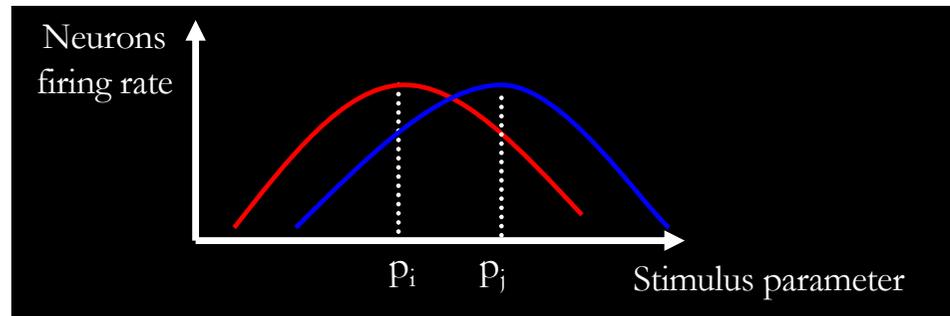
# Cortical Columns in Rodent S1

Column Size	Rat		Mouse	
	430 x 430 x 2000 $\mu\text{m}$ (C/D barrel)		220 x 220 x 1150 $\mu\text{m}$ (C/D barrel)	
Layer	Excitatory Ns	INs	Excitatory Ns	INs
L1	10 $\pm$ 7	53 $\pm$ 6		26 $\pm$ 8
L2	1701 $\pm$ 484	338 $\pm$ 40	546 $\pm$ 49	107 $\pm$ 7
L3	3398 $\pm$ 807	338 $\pm$ 109	1145 $\pm$ 132	123 $\pm$ 19
L4	4089 $\pm$ 425	358 $\pm$ 15	1656 $\pm$ 83	140 $\pm$ 9
L5	3267 $\pm$ 300	705 $\pm$ 93	1095 $\pm$ 96	221 $\pm$ 20
L6	4425 $\pm$ 320	427 $\pm$ 48	1288 $\pm$ 84	127 $\pm$ 9
<b>Total</b>	<b>16889</b> ( $\pm$ 423)	<b>2220</b> ( $\pm$ 198)	<b>5730</b> ( $\pm$ 444)	<b>744</b> ( $\pm$ 72)

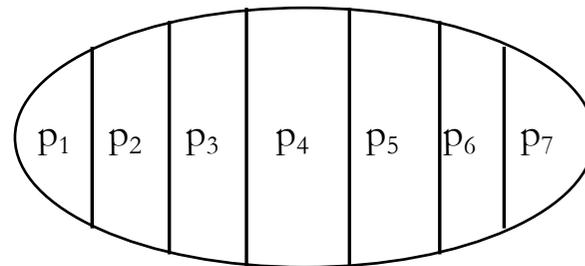
Hanno Meyer et al., PNAS 108:16807-16812, 2008  
 Sandrine Lefort et al., NEURON 61:301-316, 2009

# Functional maps in the barrel cortex

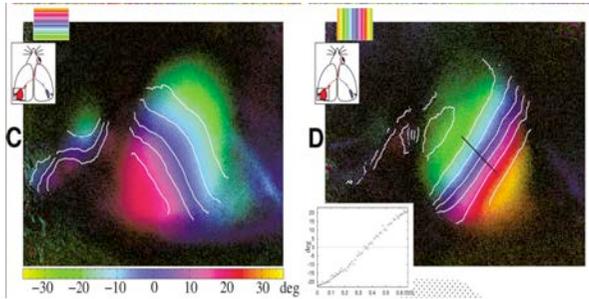
Tuning curve : Neuronal response as a function of the value of a stimulus parameter



Maps : Domains in which neurons are tuned to the same value of the stimulus parameter



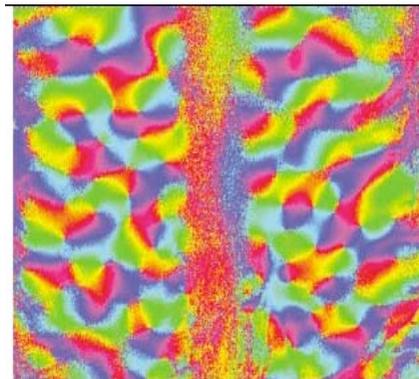
# Functional maps are encountered in many cortical areas



Position maps  
(elevation and azimuth)  
in the rat visual cortex.

Kalatzky Neuron 38 (2003) 529

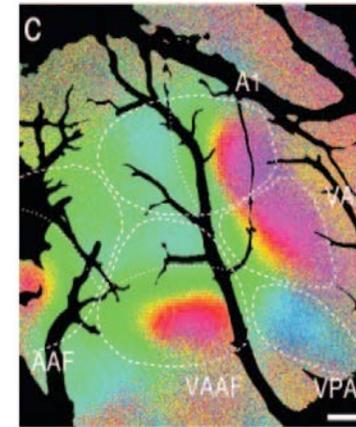
## Visual cortex



Orientation map  
in the cat visual cortex.

Kalatzky Neuron 38 (2003) 529

Direction selectivity



2 4 8 16 32 (kHz)

Kalatsky PNAS 102 (2005) 13327

Frequency bands in the  
rat auditory cortex.

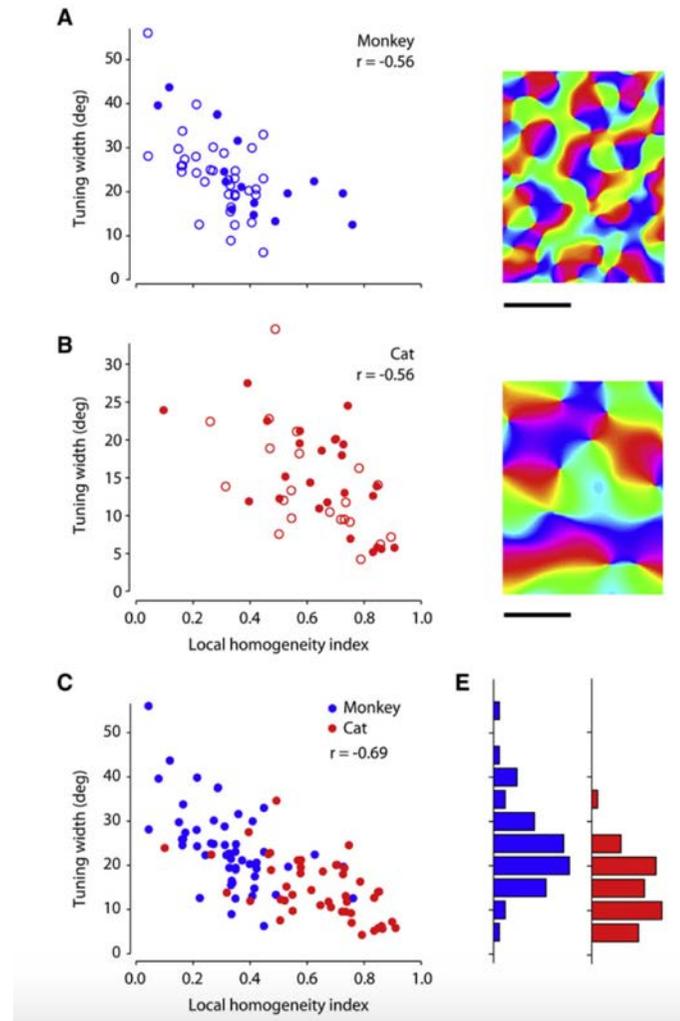
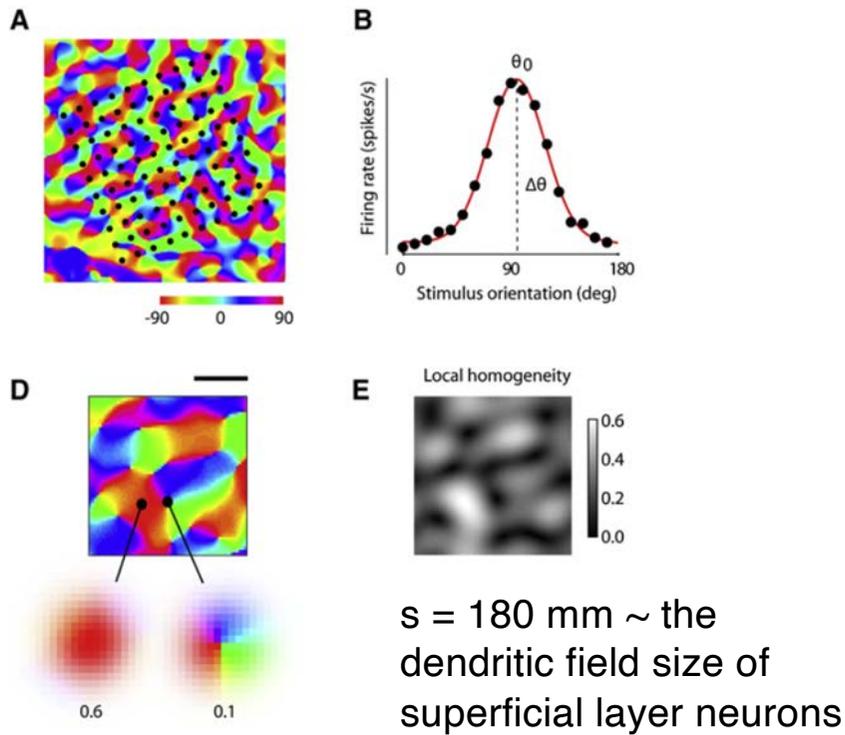
## Auditory cortex

**Maps** are **mesoscopic landmarks** at the surface of the cortex,

- **Easy to visualize** by different methods
- Allow thus to analyze the consequences of **developmental disorders, sensory deprivation, learning** etc...

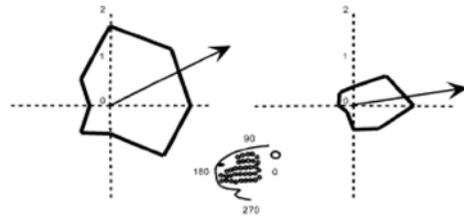
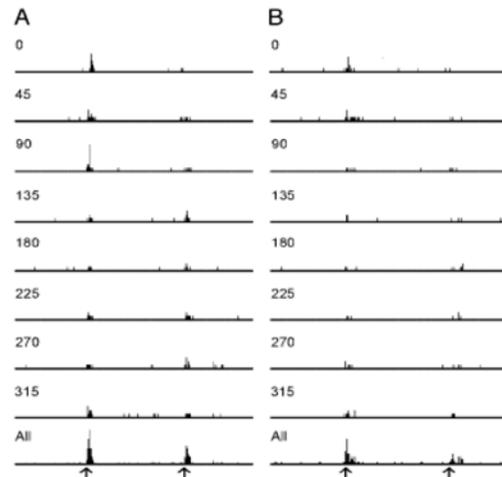
# Possible role of functional maps

## Link between domain size and tuning strength

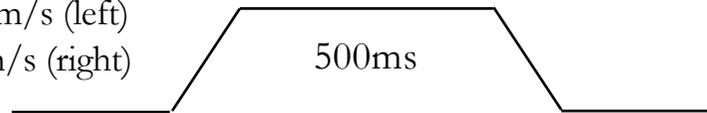


# I) Late emergence of the direction selectivity map

Direction - selective cells  
in the barrel cortex

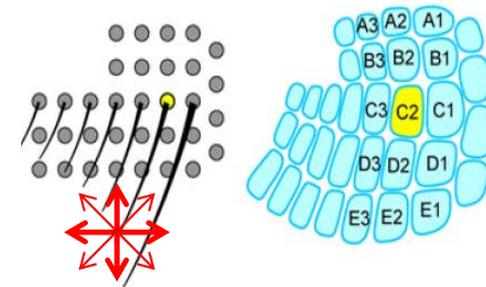
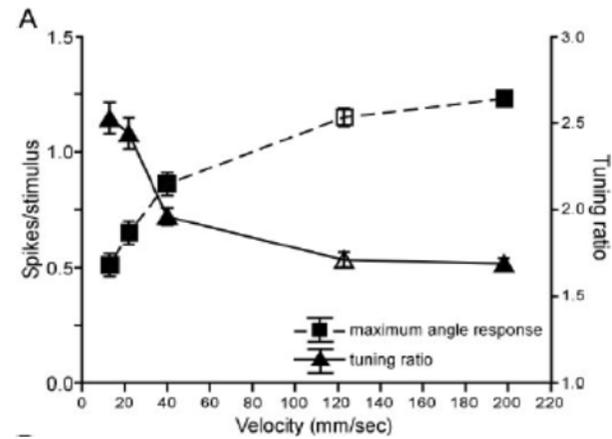


200mm/s (left)  
40mm/s (right)

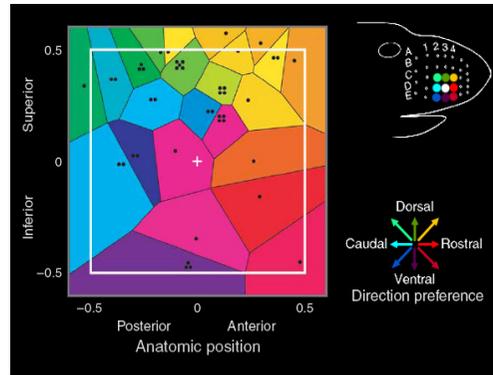


Ramp and Hold Stimulation

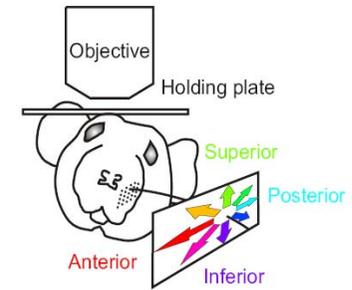
Simons, 2004



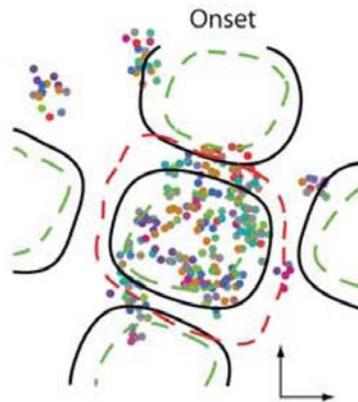
# A controversial map



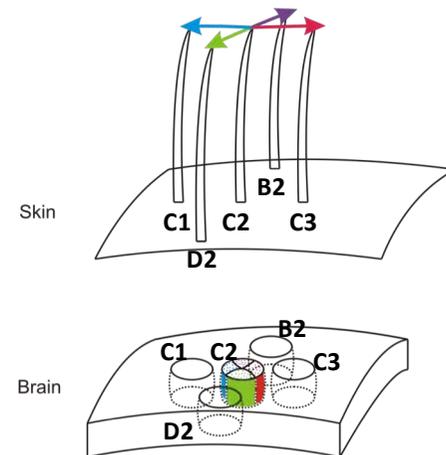
Andermann 2006



Radial organization of direction preference (pinwheel: )

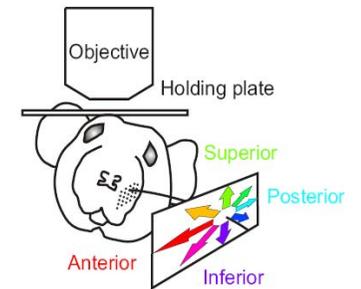
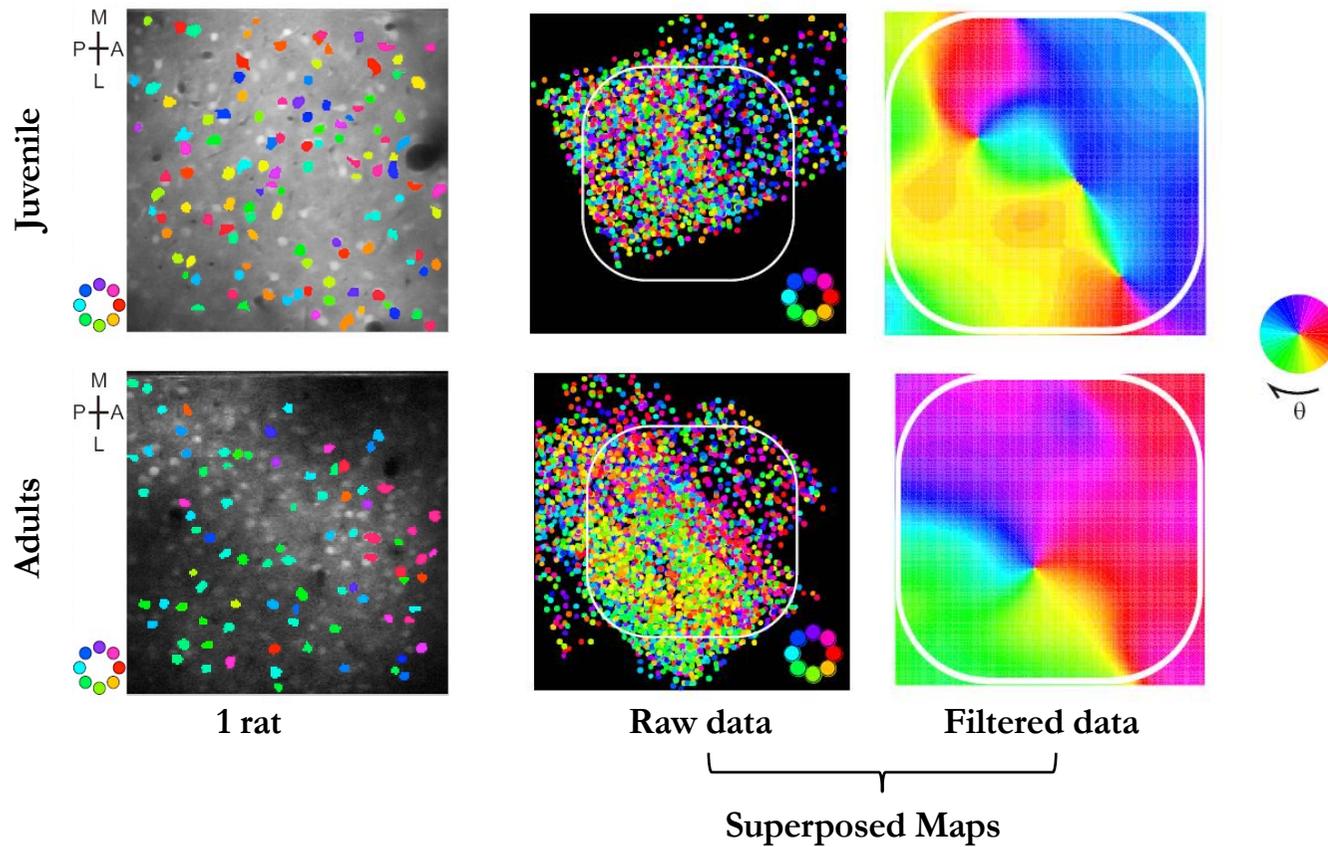


Kerr 2007



Absence of radial organization of direction preference

# The direction map emerges in adult animals



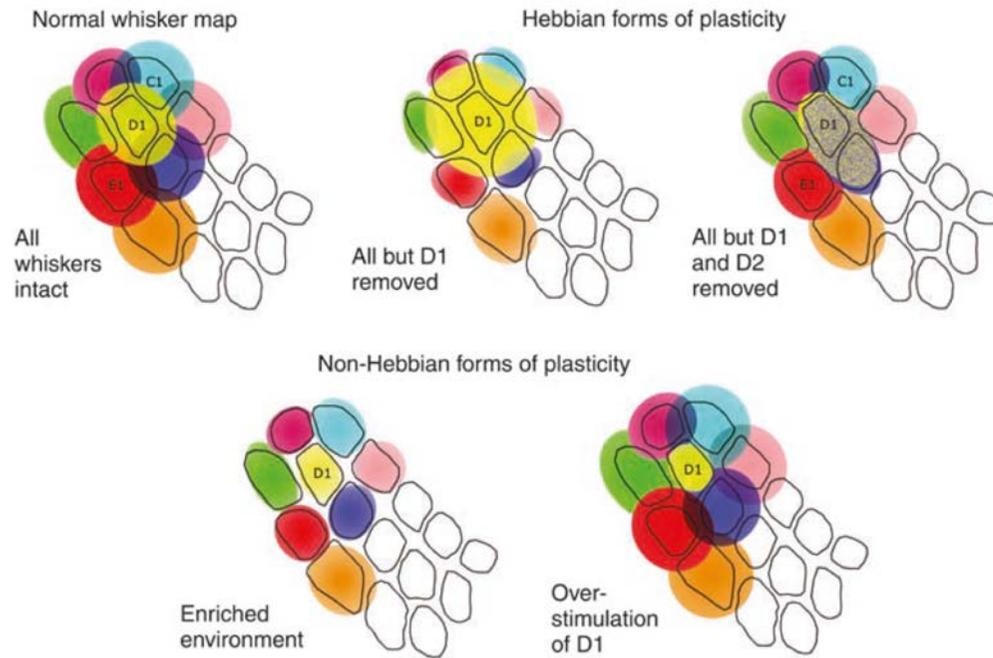
Rats (juvenile and adults)  
Oregon Green Ca Dye  
Anesthetized  
Acute

**Kremer et al. *J. Neurosci.* 31(29)  
(2011) 10689-10700**

# Early development of functional maps

- **Early development** of sensory cortical maps : **before the first postnatal month** in rodents.
  - Rodent, barrel field, layer 4 : a few days after birth (Inan and Crair, 2007; Petersen, 2007),
  - Rodent, barrel field, layer 2/3 receptive fields for vibrissa stimulation : 2 weeks postnatal (Stern et al., 2001).
  - Mouse, visual cortex, maps for visual space and ocular dominance : at eye opening (Smith and Trachtenberg, 2007).
  - Rat, auditory cortex AI, tonotopic map of sound frequency : 3 weeks postnatal (Zhang et al., 2002).
  - Cat, visual cortex, orientation map : before the end of the second postnatal week (Crair et al., 1998),
  - Ferret, visual cortex, direction selectivity map : just after the time of eye opening (Li et al., 2008).
- **Sensory activity** is known to **shape and strengthen sensory cortical maps** during **early postnatal life**:
  - Ocular dominance in the rodent visual cortex (Berardi et al., 2000; Smith and Trachtenberg, 2007)
  - Orientation and direction selectivity in the cat and ferret visual cortex (Crair et al., 1998; Li et al., 2008).
- Barrel cortex **direction selectivity map** emerges surprisingly **late**.
  - Could **plasticity** on its own be the **basis of the formation of the direction selectivity tactile map** ?
  - **Plasticity** is maintained **throughout life in the cortex** (Shulz and Frégnac, 1992; Karmarkar and Dan, 2006; Petersen, 2007).
  - **Activity-dependent plasticity in SIbf** both at the cellular level (Glazewski and Fox, 1996; Jacob et al., 2008) and at the scale of the barrel (Feldman and Brecht, 2005; Frostig, 2006).

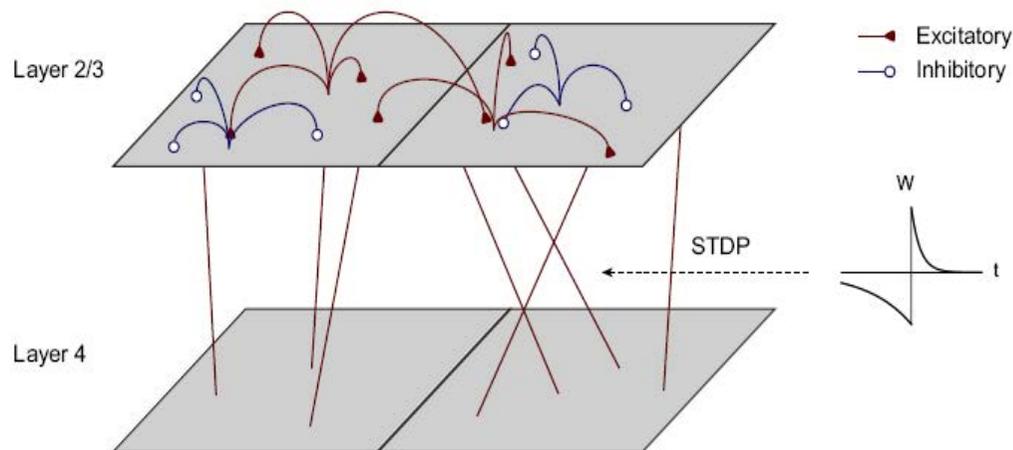
# Functional maps



D. E. Feldman and M. Brecht,  
Science 2005

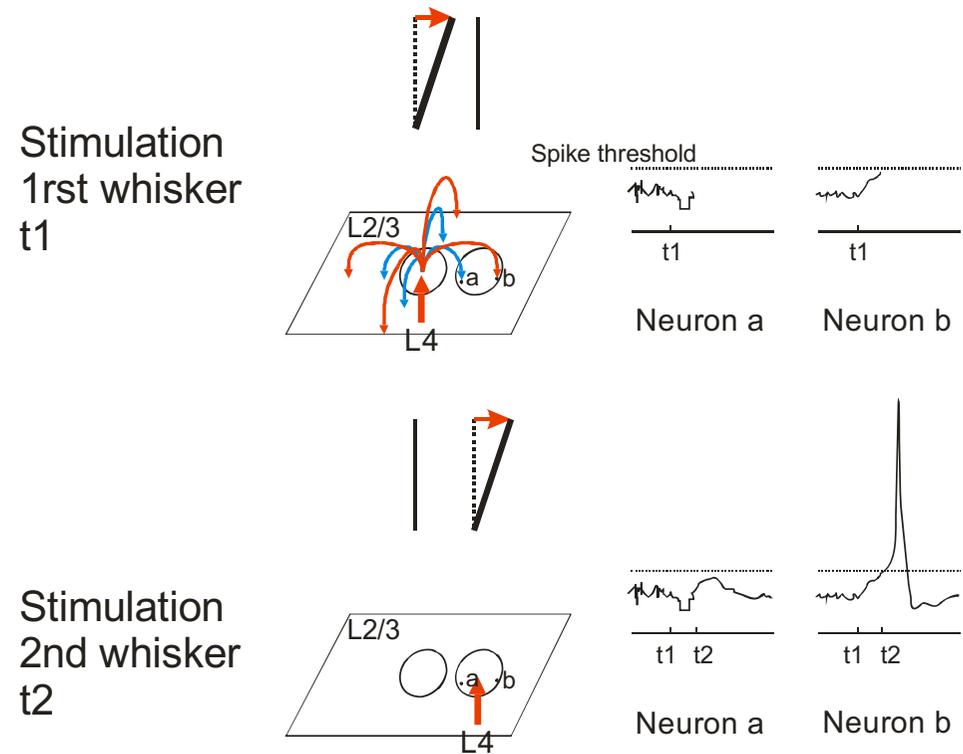
# This map emerges through sensory learning

- **Late (>P40)** development of the map
- **Map linked to the somatotomy.**
- **Link between direction of deflection and the somatotomy ?**  
An object deflects in a specific direction and successively neighboring whiskers
- **Numerical Model**  
Realistic network architecture + simple plasticity rules (STDP) at L4-L2/3 synapses + training



Dan Goodman, Romain Brette  
DEC, ENS

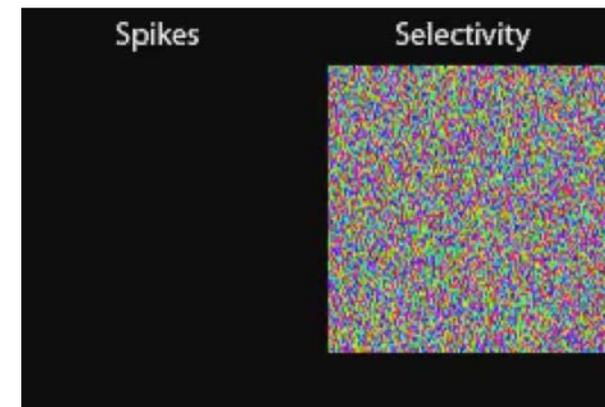
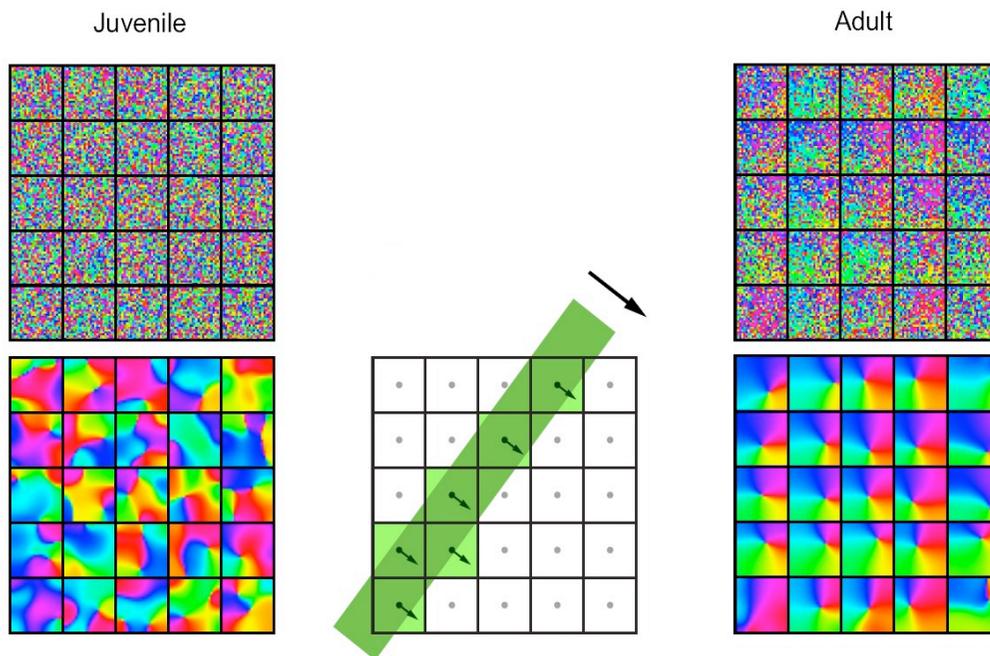
# Network mechanisms underlying the map emergence



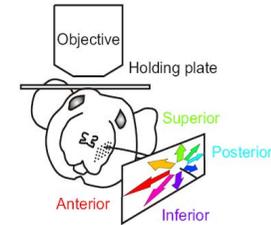
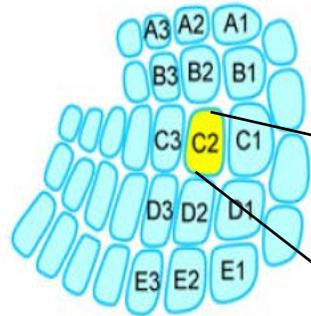
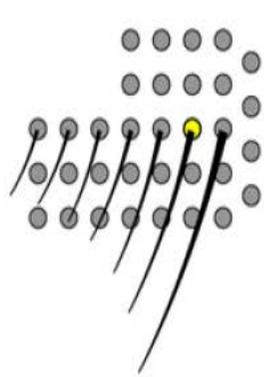
Connexion L4 to neuron b  
potentiated via STDP

# Sensory training induces the map formation

- Realistic neuronal network (L4-L2/3 and L2/3-L2/3 connections)
- Plasticity rule (STDP)
- Learning with natural stimuli (bars)

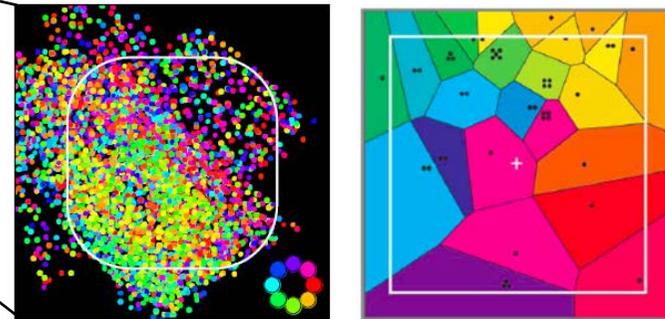


# Functional maps in the barrel cortex



**Barrels = map of whisker identity**

Woolsey TA, Van der LoosH (1970) Brain Res 17:205–242.



**Intra-barrel direction selectivity map**

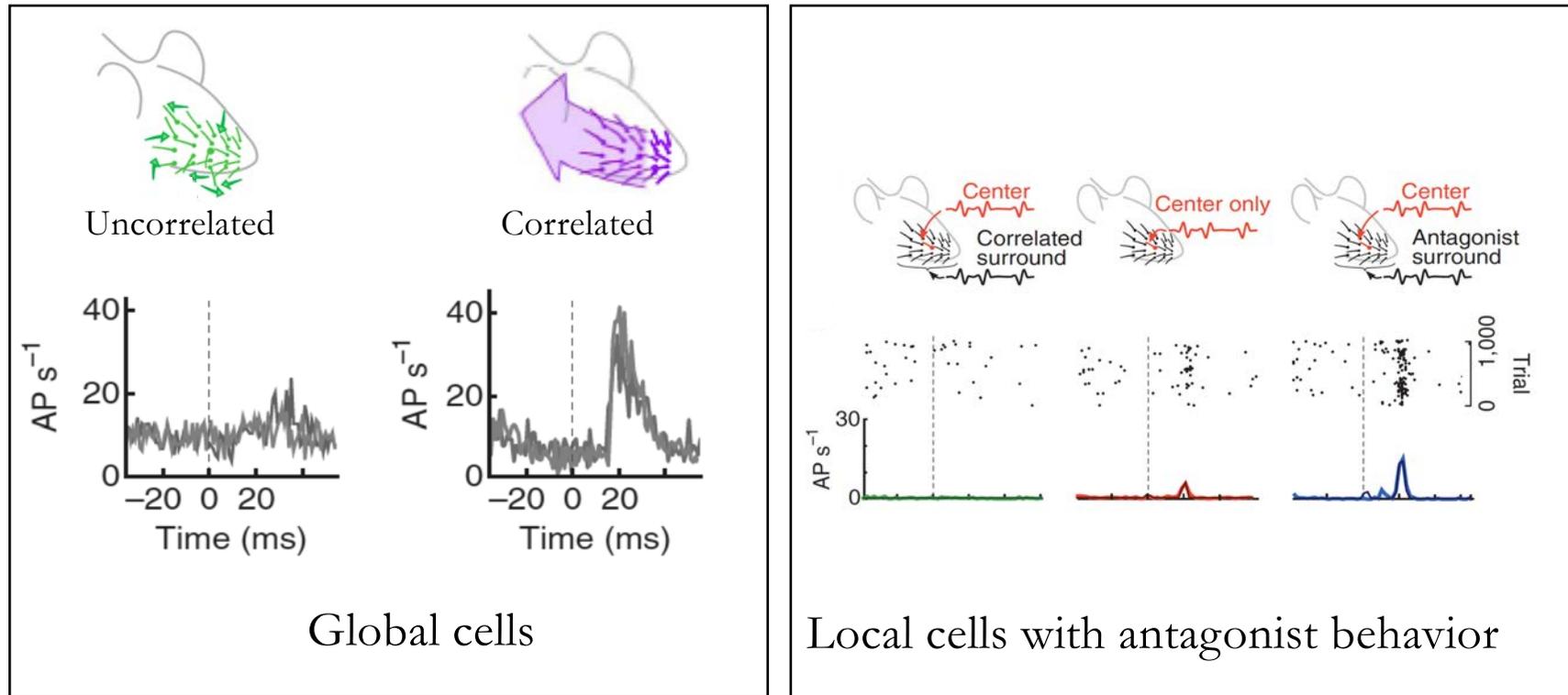
Late emergence in enriched environment

- Andermann ML, Moore CI (2006) Nat Neurosci 9:543.
- Kremer Y et al (2011) J Neurosci 31:10689.

- a **surprisingly late development** after all known critical periods
- Direction selectivity maps reflect the **unsupervised learning of natural stimuli statistics**

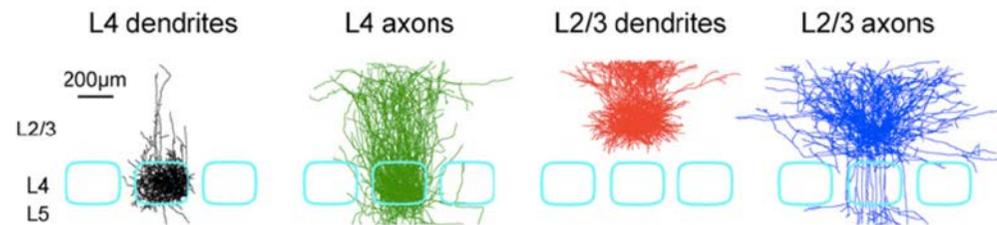
## II) Superposition of functional maps in the barrel cortex

Estebanez et al., Nat Neurosci, 2012



**Highly non-linear responses to synchronous stimulations of several whiskers in Layers 4/5**

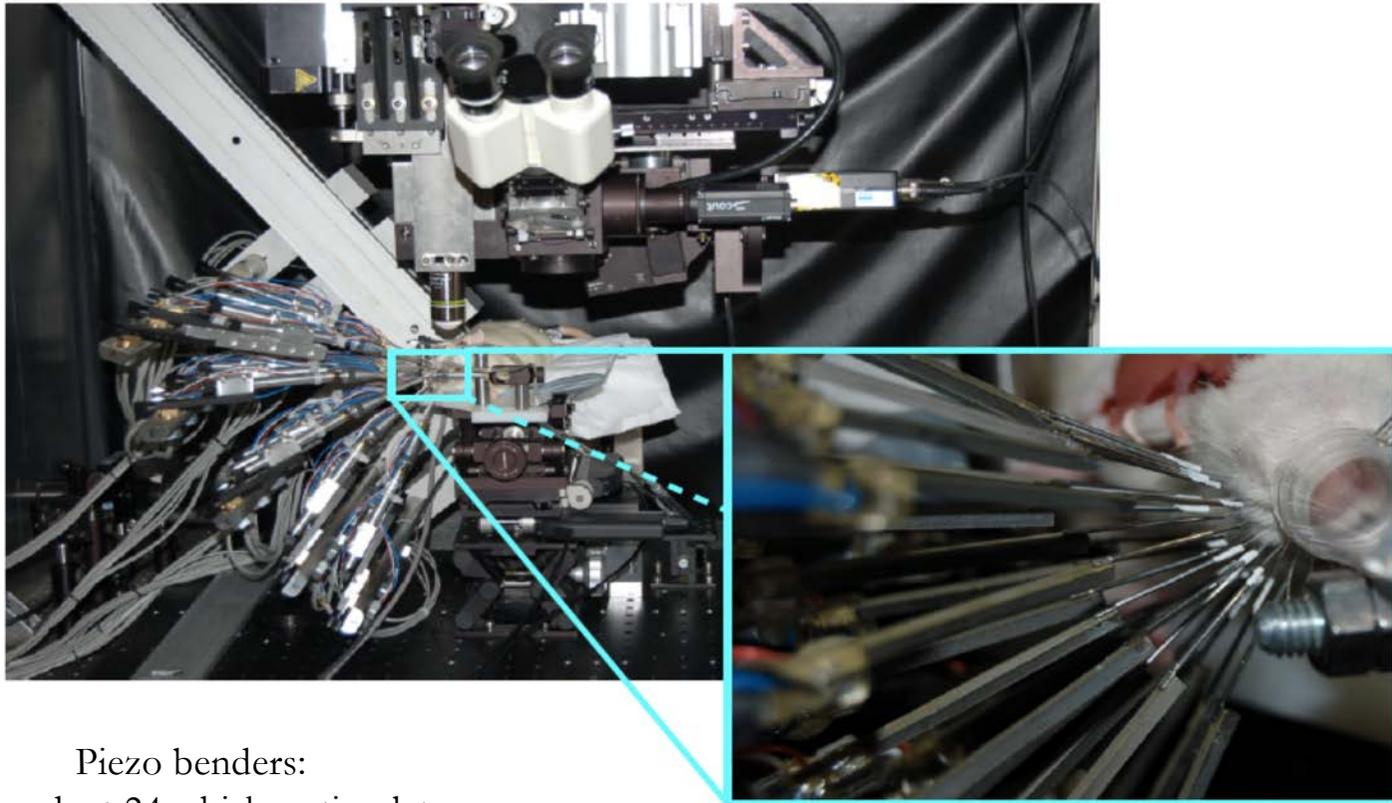
- Are there cells with a non-linear response to temporally correlated deflections of several whiskers in layer 2/3 ?



Petersen 2003

- Is there a specific functional mapping of such cells?
  - Naturalistic stimuli are multiwhisker : unsupervised learning
  - No map of the tuning to multi-whiskers correlations has been described.
  - How can multiwhisker correlated deflections be mapped on the barrel / septa map of single whiskers ?

## A multi-whisker stimulation Matrix »

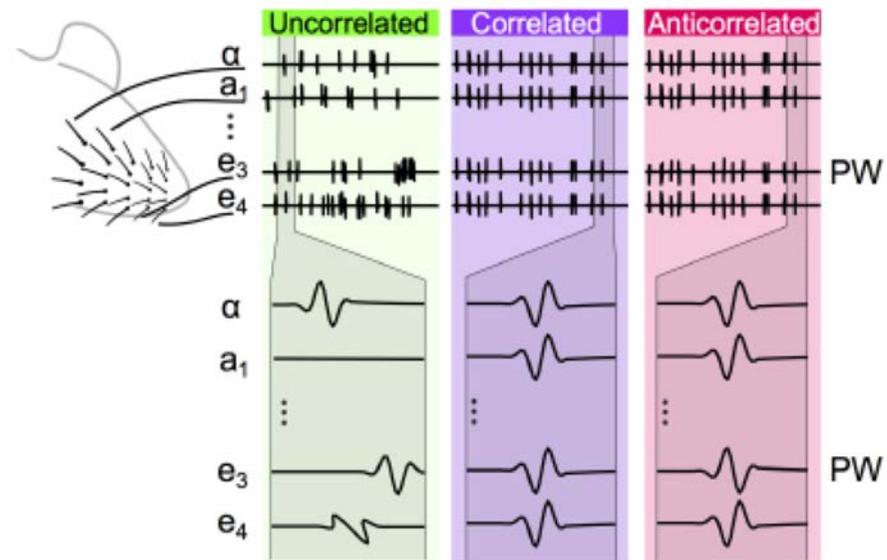
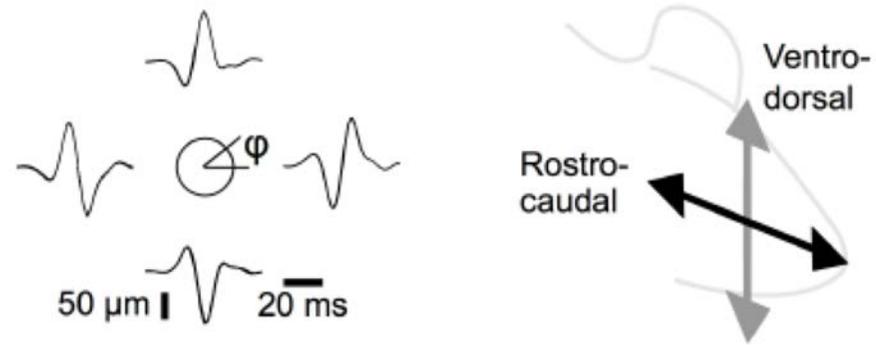


Piezo benders:  
independent 24 whisker stimulator

**Daniel Shulz, UNIC, CNRS, Gif/Yvette**

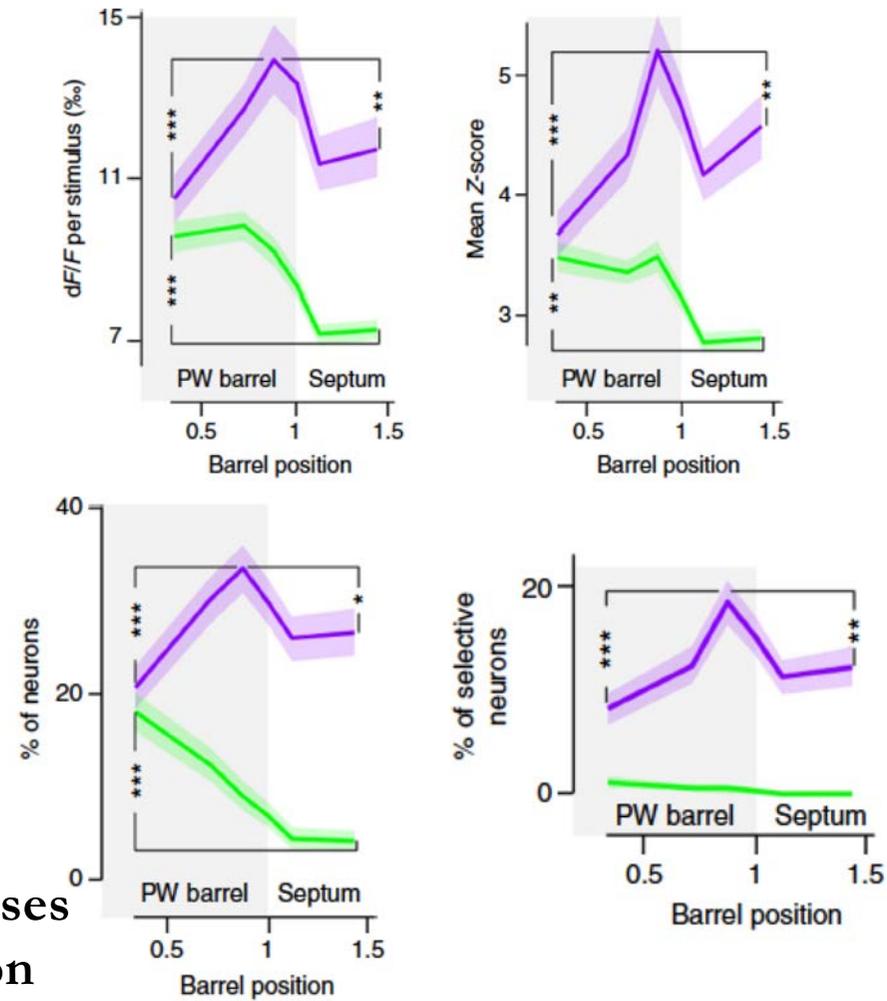
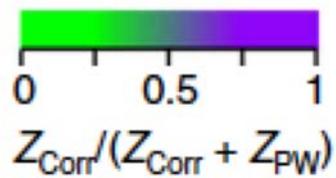
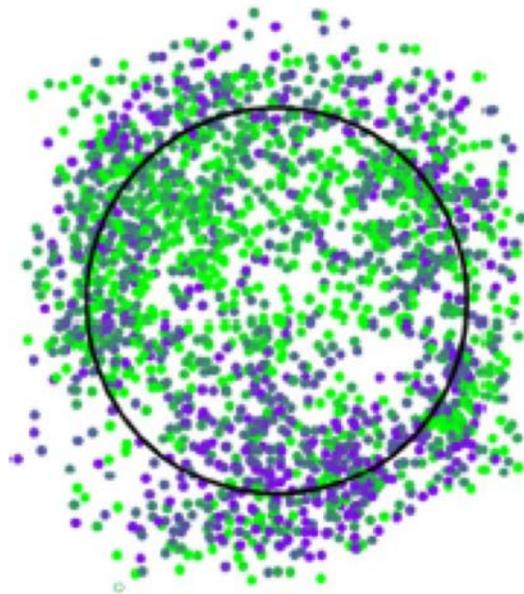
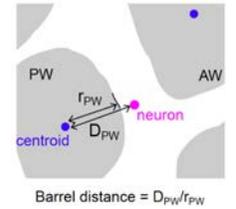
# Complex, naturalistic stimulations

2 phases,  
4 cardinal directions



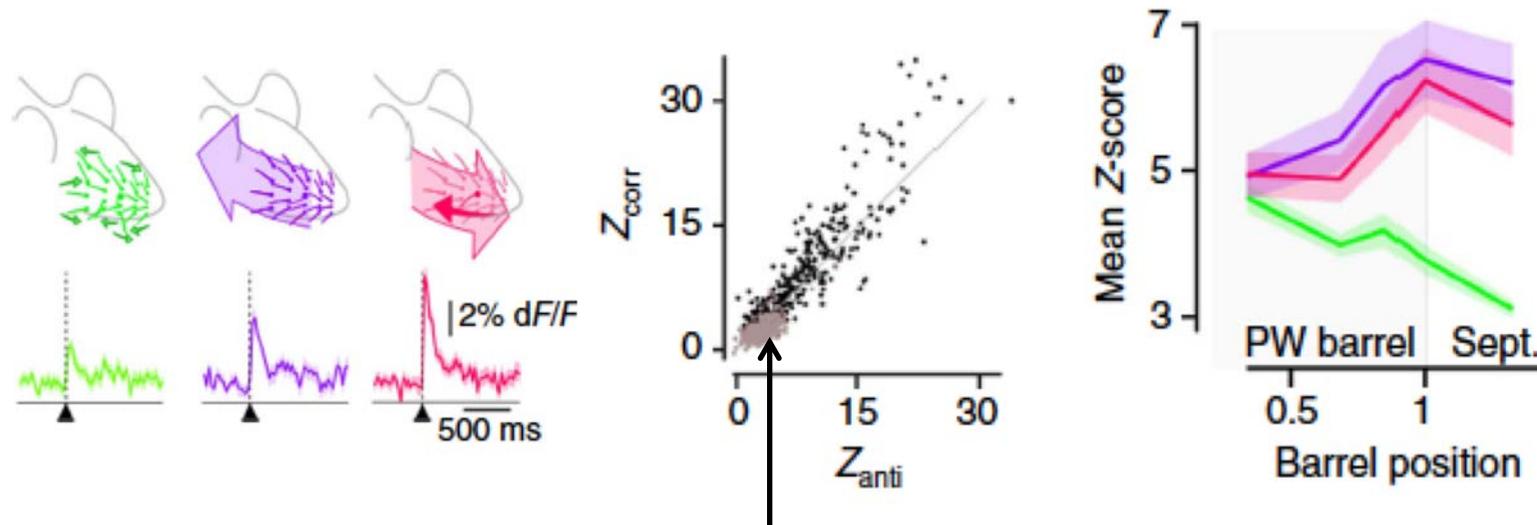
**Only multiwhisker statistics varied with no change in single-whisker stimulus statistics.**

# Mapping : a population analysis



A concentric map of responses to multi-whisker correlation

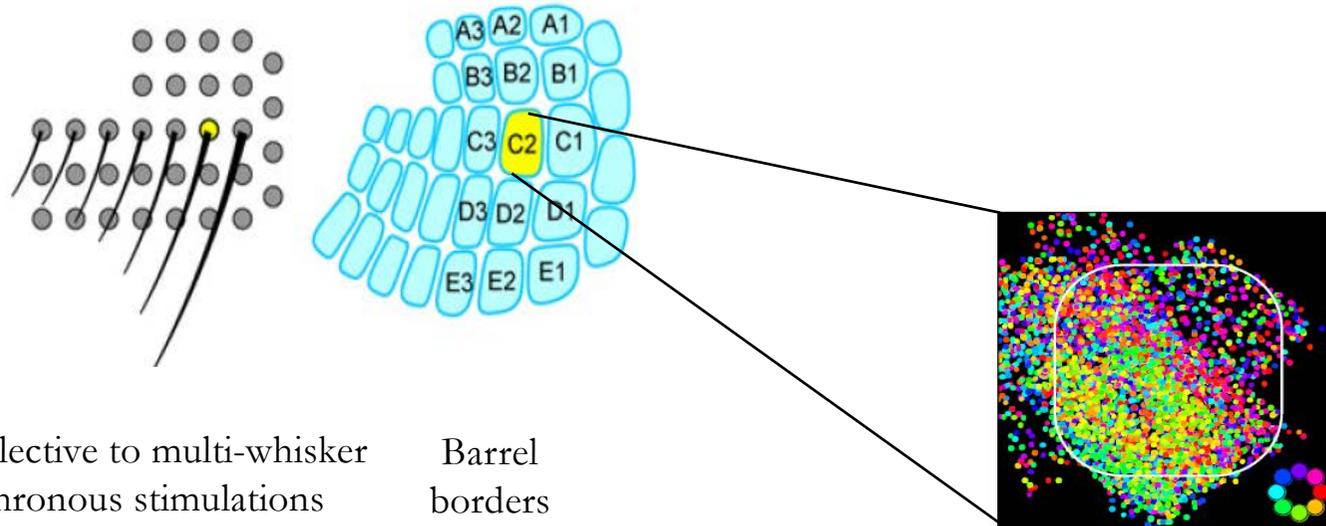
## Selectivity to anticorrelated stimulations



neurons preferring uncorrelated  
over correlated stimulations

**The ring is made of cells selective to the synchrony shared by the two multi-whisker stimulations (correlated and anti-correlated)**

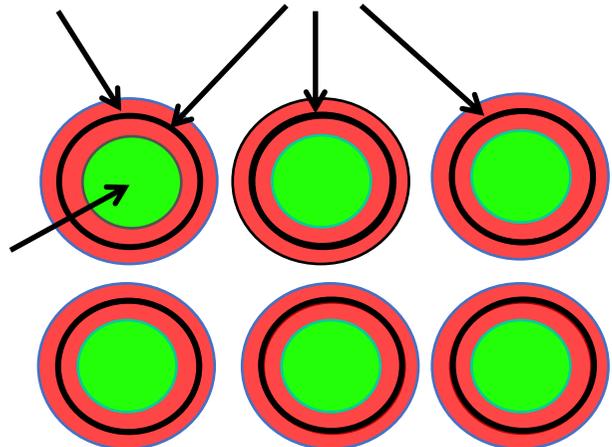
# Functional maps in the barrel cortex



Cells selective to multi-whisker synchronous stimulations

Barrel borders

Cells selective to uncorrelated stimulations



**At least 3 functional maps superimposed in the barrel cortex**

### **III) Learning of a tactile information during an active tactile task**

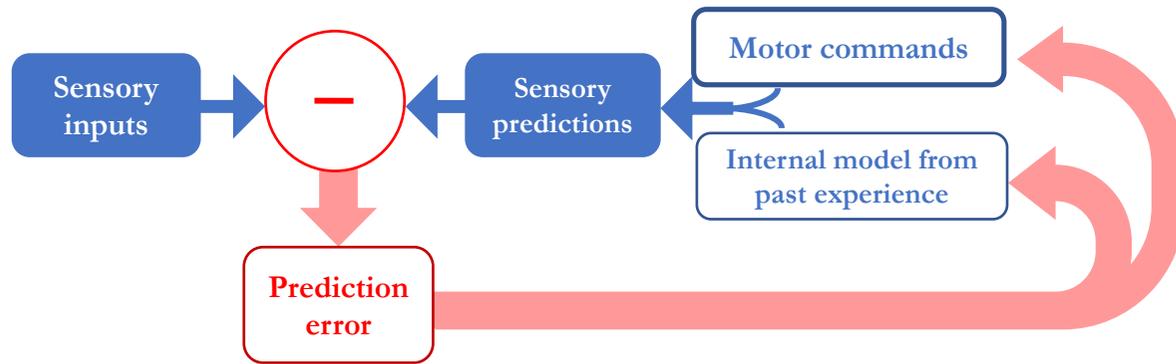
Tactile whisker perception are active tasks

Previous experiments were achieved anesthetized, but maps reflect active perception

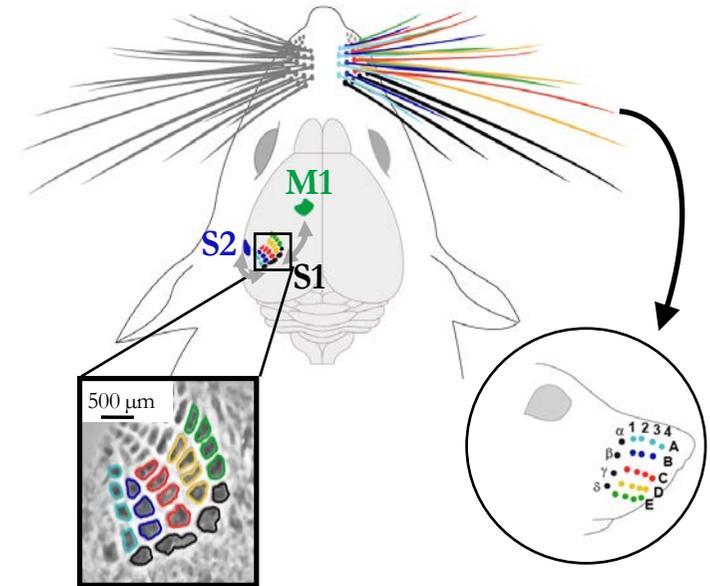
Reinforcement learning of tactile information

# Neuronal mechanisms of the predictive coding during an active tactile sensorimotor task

## Predictive Coding



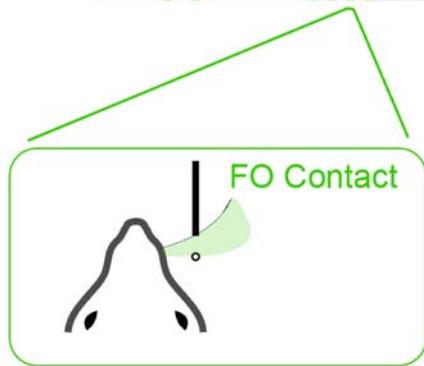
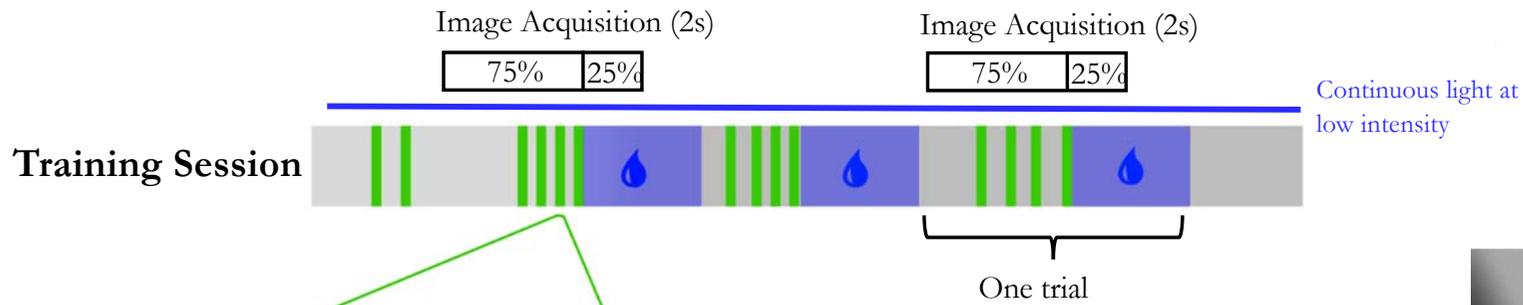
## S1-S2-M1 circuit



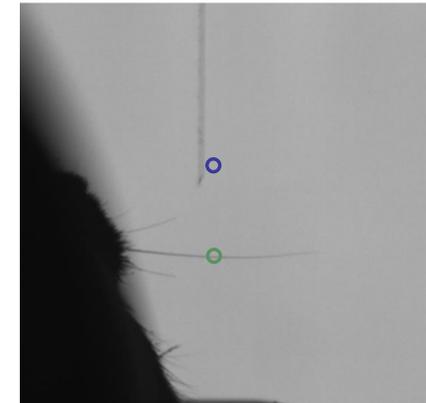
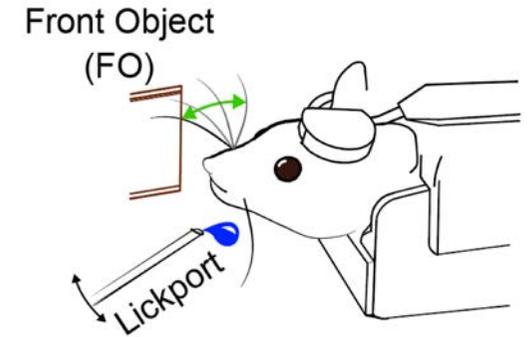
Primary somatosensory Cortex (layer IV)

# Task design

■ Object presence      ■ Reward period

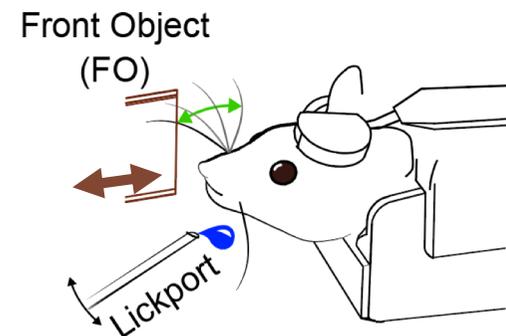
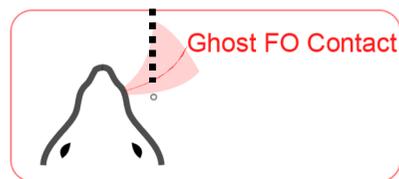


Progressive training from 2 to 4 consecutive FO **Big touches**  
Inter contact time interval (300 ms)



# Recording of successive sessions with either **Omissions** or **Mismatch** touches

- Object presence
- Object absence
- Reward period
- Object displacement



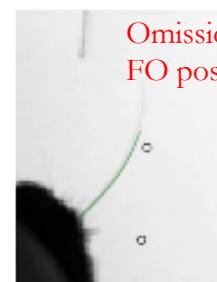
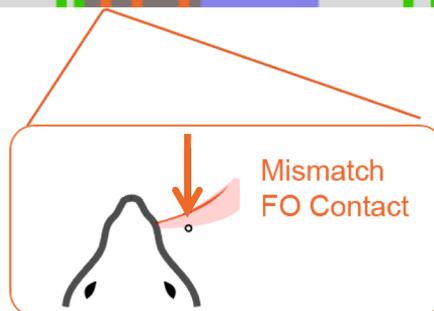
**Omission Session**  
(10% violation trials)



**Mismatch Session**  
(10% violation trials)



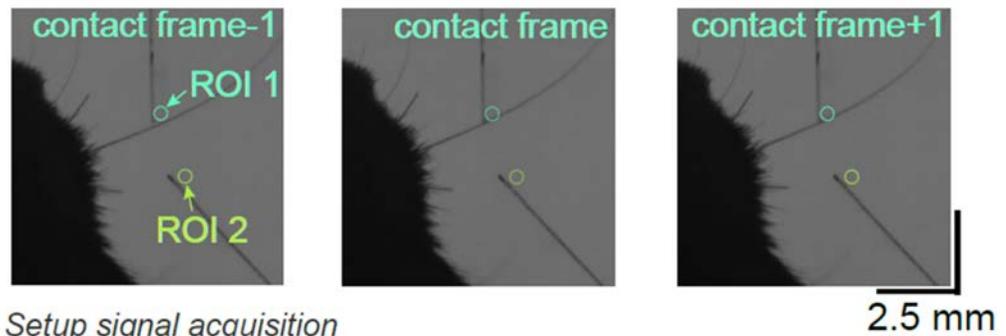
Mismatch distance  
0.9 mm



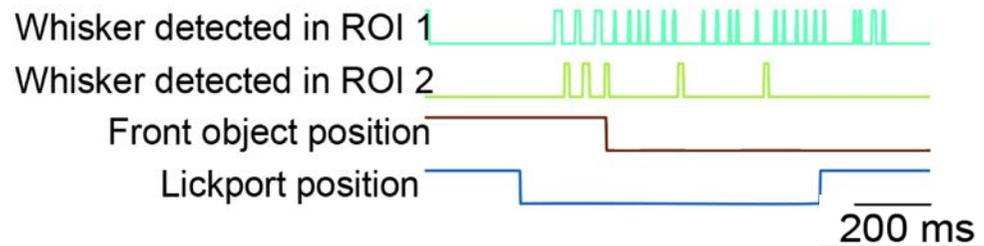
# The behavioural task and the experimental setup



**Robust real-time contact detection at 500 Hz**

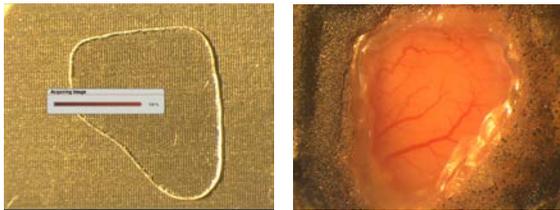
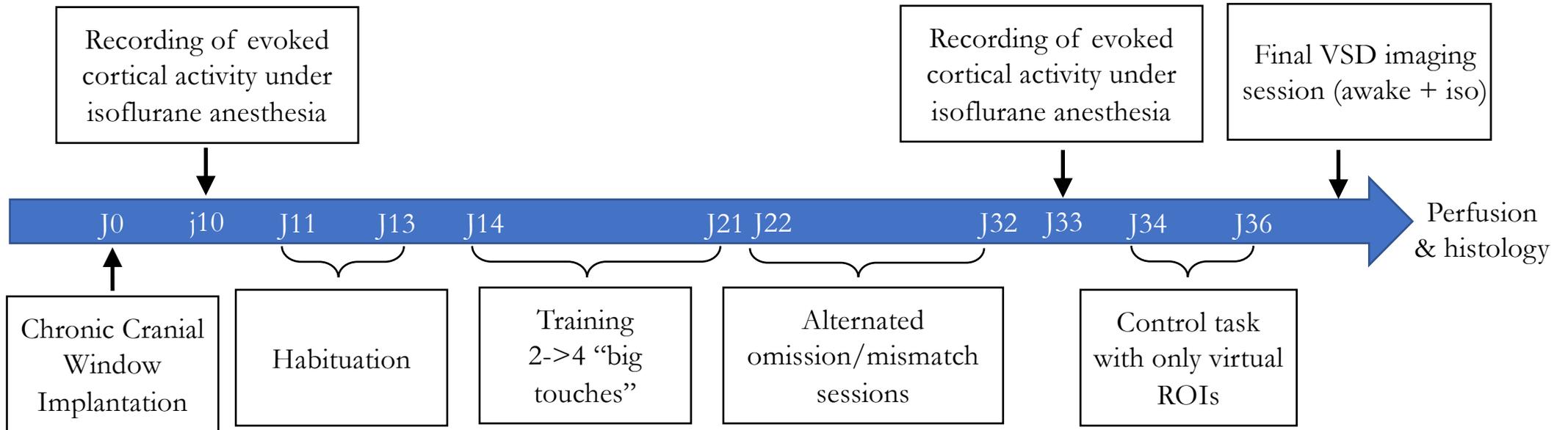


*Setup signal acquisition  
of one example VSD recorded omission trial*



**Displacement of the object is faster than half of the whisk cycle**

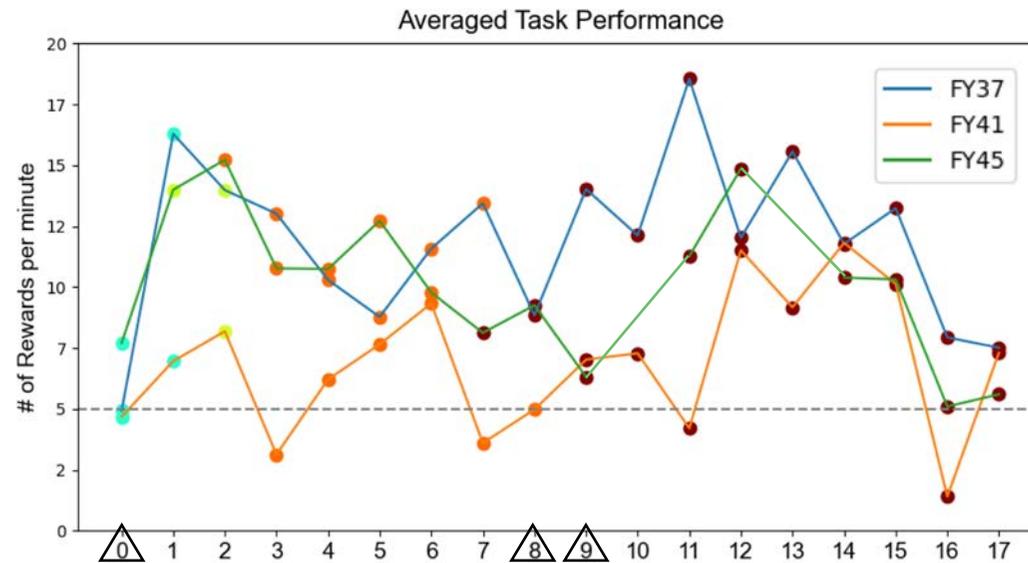
# Longitudinal chronic widefield Calcium imaging (GCaMP6f) through custom made large windows



# Learning curves

Number of required **consecutive** touches for one reward

● 2   ● 3   ● 4   ● Omission/ Mismatch



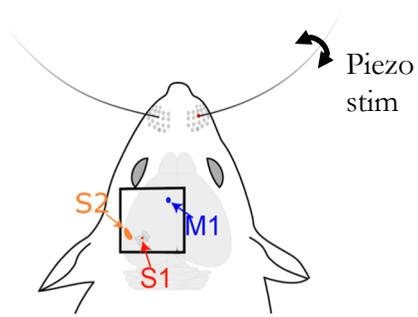
Maximum 200 rewards or 40 minutes per session

Neural activity recording for each session

Multiple omission/mismatch session

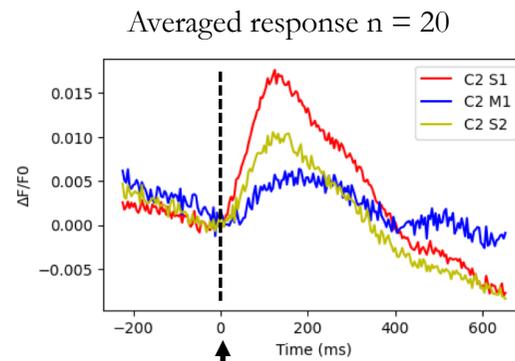
# GCaMP functional imaging under anesthesia to localize cortical areas

C2 whisker stimuli under anesthesia

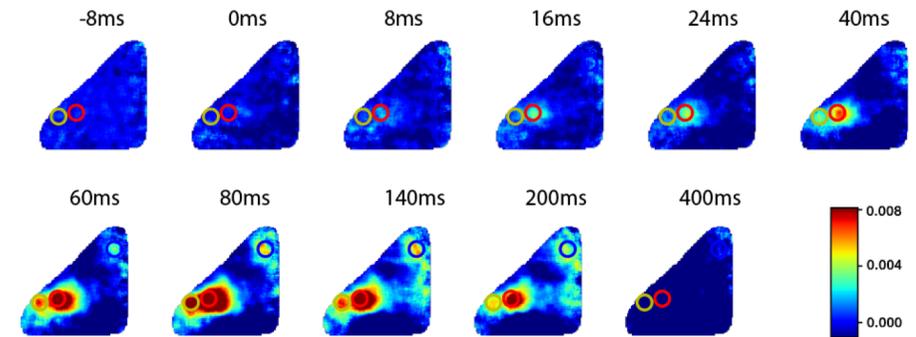


FOV: 6.58 x 6.58 mm

GCaMP6f signal

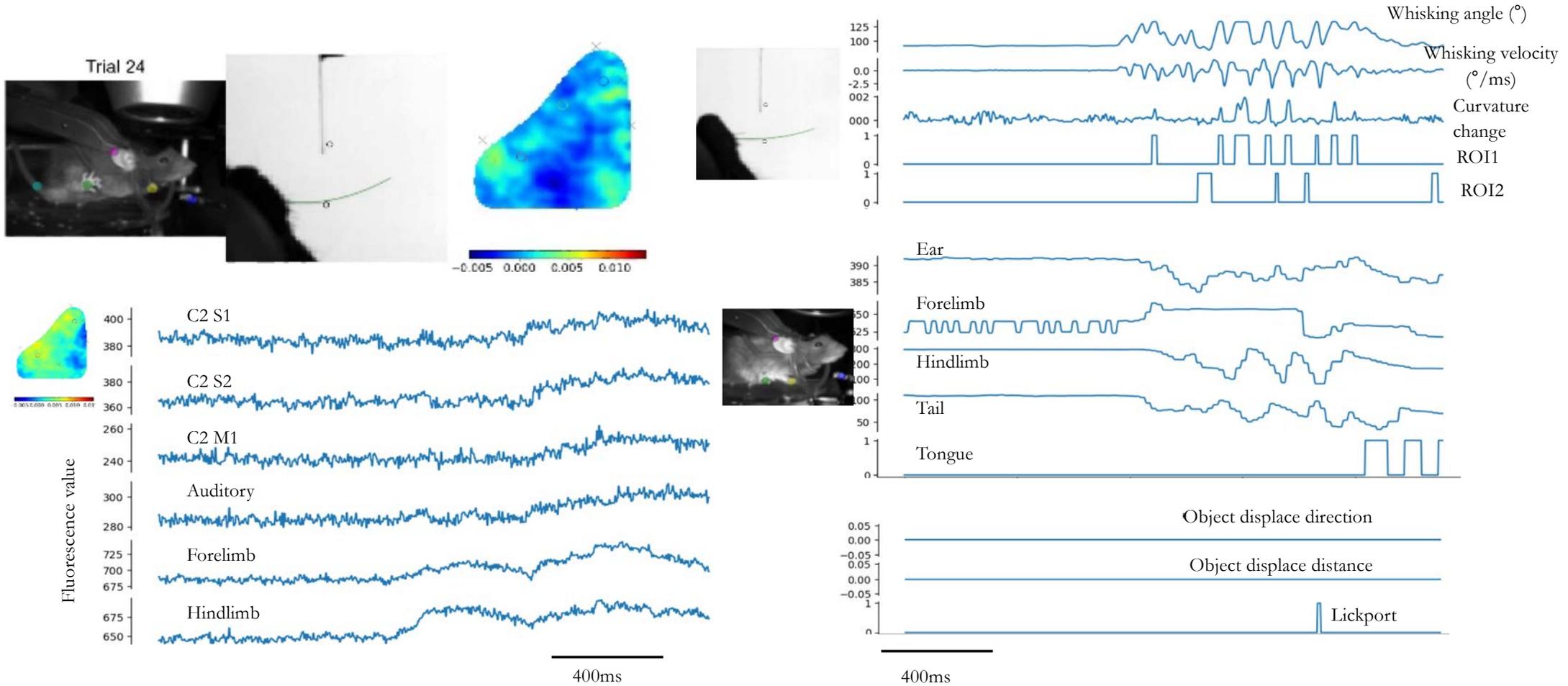


C2 whisker stimulus

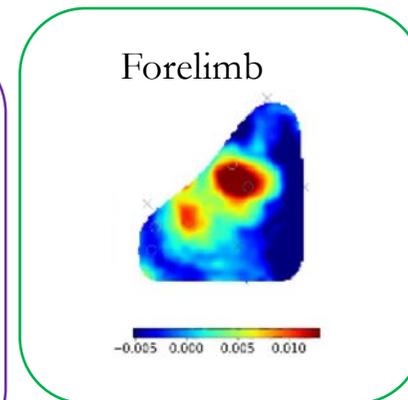
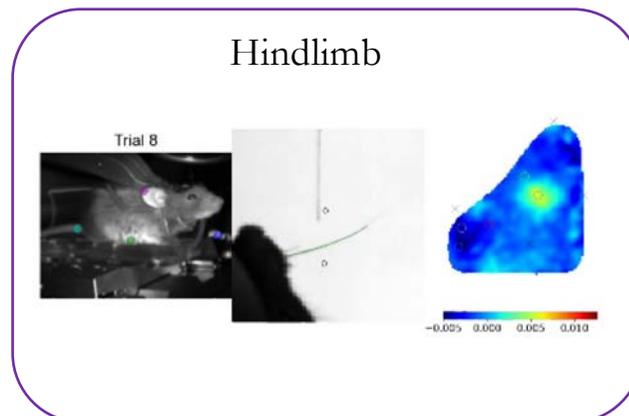
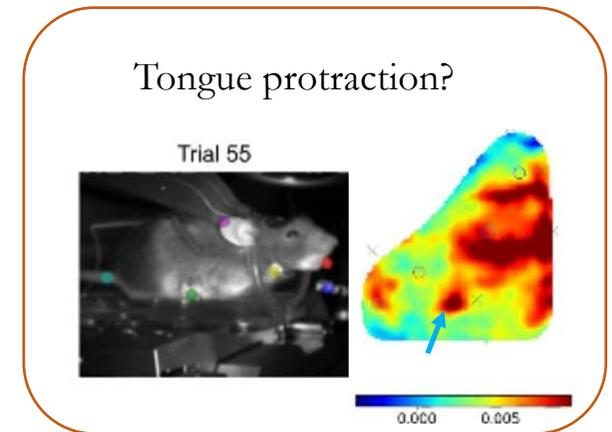
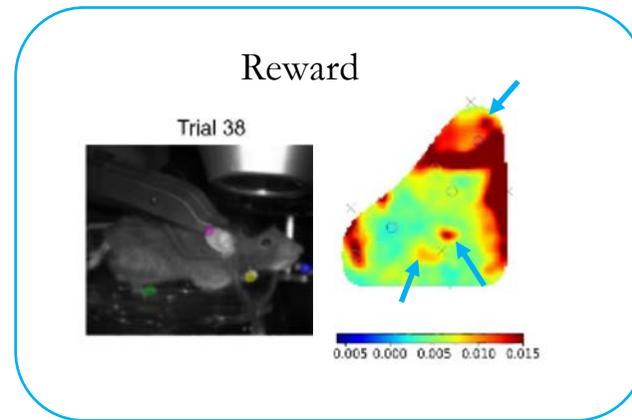
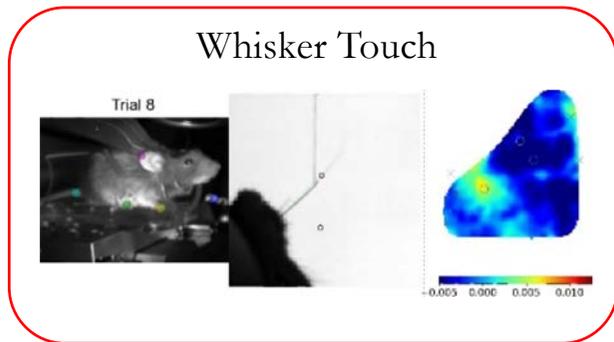


Mouse no .37

# Behavioural and Neural data example trial



## Recurrent motifs of spatiotemporal dynamics



Focus on touches preceded by large inter-contact intervals ( $>300$  ms)

## Conclusion and Summary

- Plasticity linked to the unsupervised learning from natural stimuli might control the late formation of the direction selectivity map in the barrel cortex
- The barrel map, the direction selectivity map and the map for synchronous stimuli are superimposed in the barrel cortex
- A new behavioural task with Reinforcement learning of repeated touches allow to study
  - Change (suppression) of the representation of touch across learning
  - Specific inhibition related to omission events

# People - Grants



Yves Kremer



Luc Estebanez



Julien Bertherat



Fan Yang



Romain Brette



Isabelle Férézou



Daniel Shulz



Jean-François Léger



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