04/07/2024

## **A retino-cortical model of anticipation**

### Jérôme EMONET

INRIA Biovision Team



Supervisor Bruno Cessac Alain Destexhe

nría

#### Financed by Shooting Star ANR







Terrifying boar

ş



40 km/h

ş









## <u>Why are you able to anticipate this</u> <u>terrifying animal?</u>

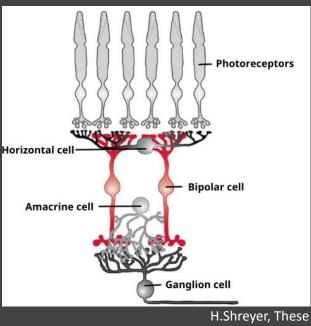


# visual anticipation

# How to study visual anticipation in a retino-cortical pathway model?

## **Retino-cortical pathway**

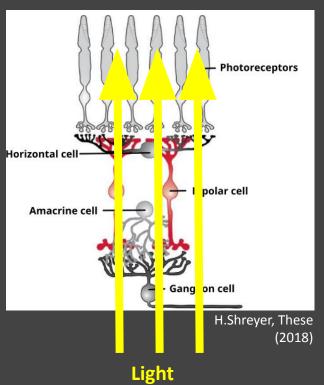
Retina



<sup>(2018)</sup> 

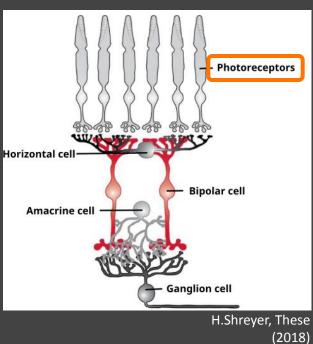
## **Retino-cortical pathway**

Retina



## **Retino-cortical pathway**

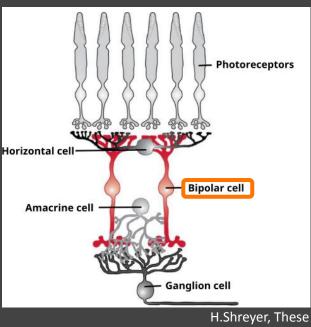
Retina



Photoreceptors transform light into electrical signals

## **Retino-cortical pathway**

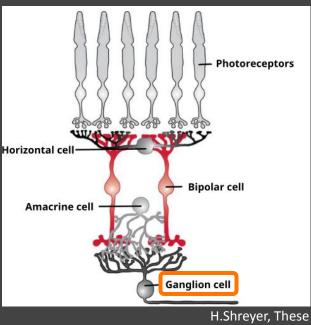
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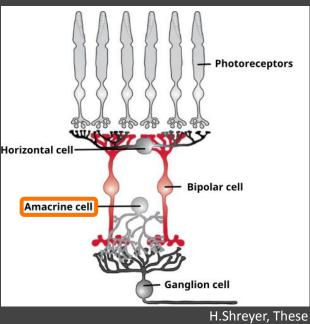
Retina



Photoreceptors transform light into electrical signals

## **Retino-cortical pathway**

Retina

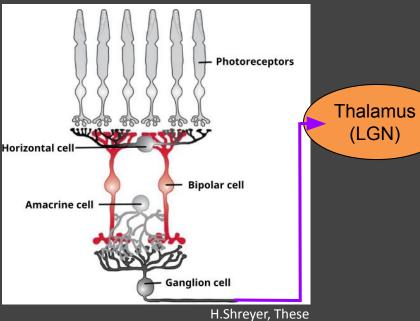


H.Shreyer, These (2018) Photoreceptors transform light into electrical signals

Amacrine cells have a modulatory effect by lateral inhibition

## **Retino-cortical pathway**

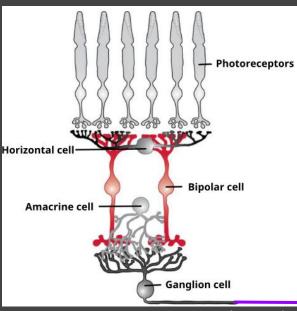
(LGN)



(2018)

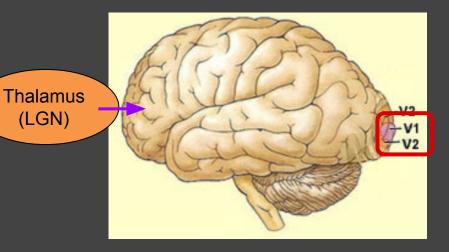
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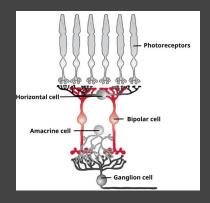
Retina

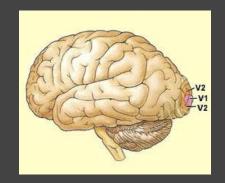


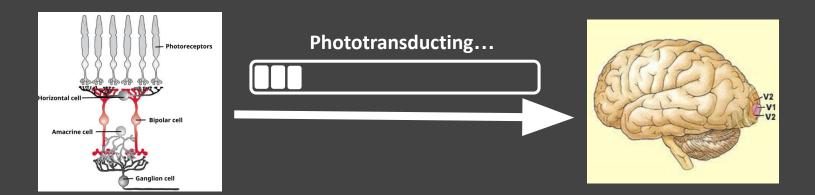
H.Shreyer, These (2018)

#### Primary visual cortex localisation







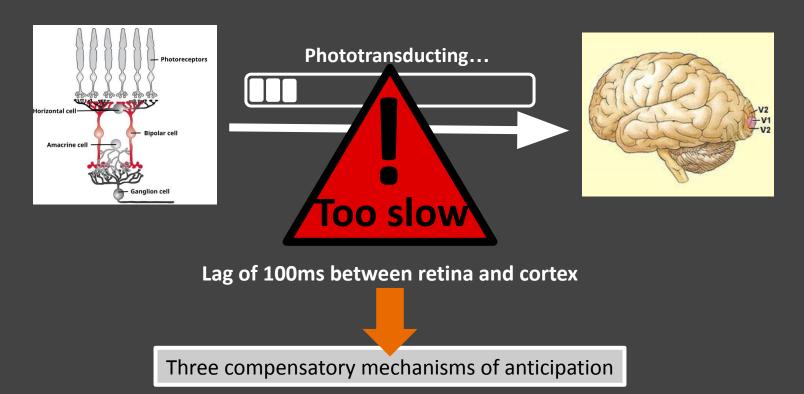




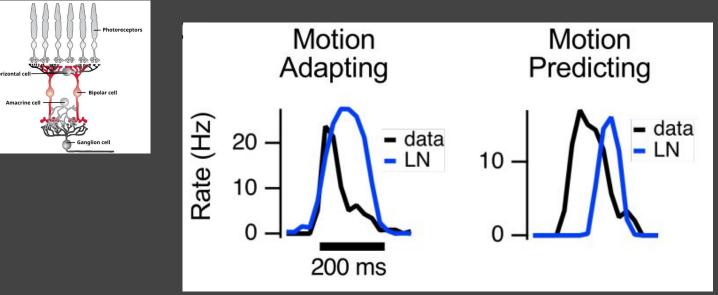
## **Retino-cortical pathway**



Lag of 100ms between retina and cortex

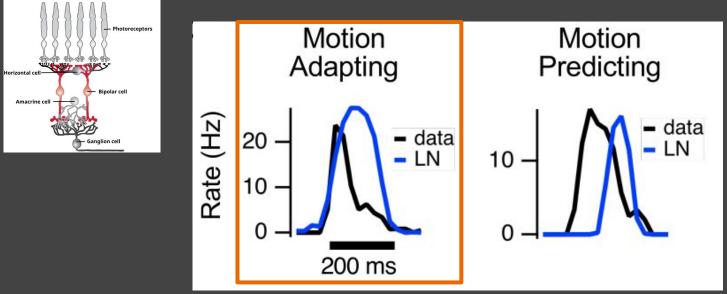


## Anticipation in the retina



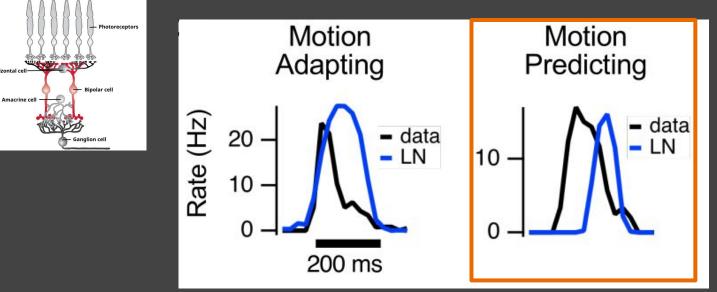
M. Menz, D. Lee and S. Baccus, bioRxiv (2020)

## Anticipation in the retina



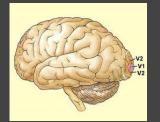
M. Menz, D. Lee and S. Baccus, bioRxiv (2020)

## Anticipation in the retina



M. Menz, D. Lee and S. Baccus, bioRxiv (2020)

## Anticipation by latency in the primary visual cortex (V1)



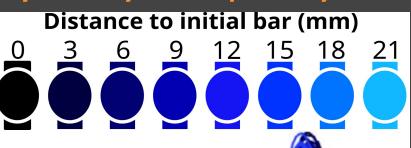


10.

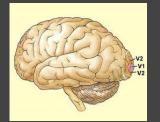
VSDI

0

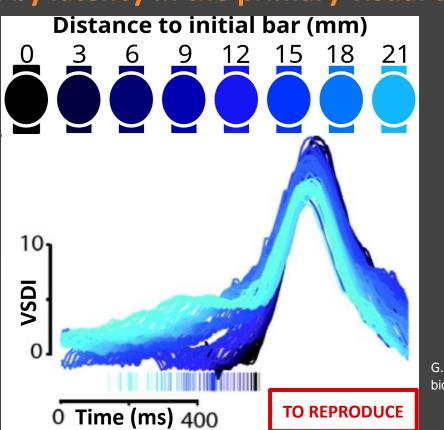
0 Time (ms) 400



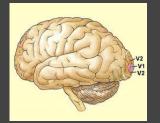
## Anticipation by latency in the primary visual cortex (V1)







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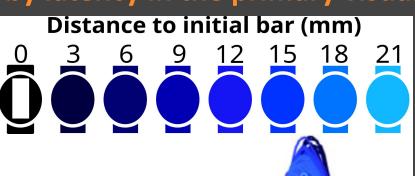


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VSDI

0

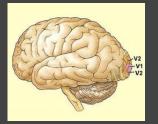
0 Time (ms) 400



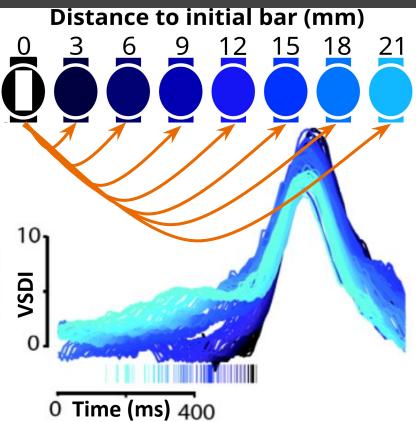
G.Benvenuti et al., bioRxiv (2020)

**TO REPRODUCE** 

## Anticipation by latency in the primary visual cortex (V1)

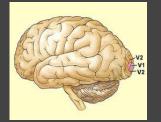




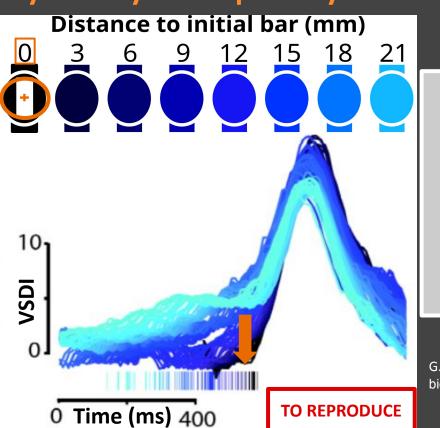


Cortical columns seeing the bar sends excitation to others not already activated by it.

## Anticipation by latency in the primary visual cortex (V1)



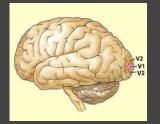




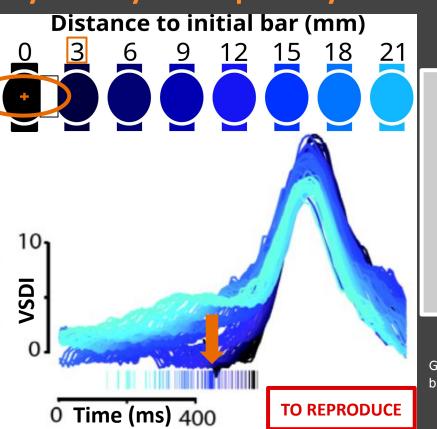
Cortical columns seeing the bar sends excitation to others not already activated by it.

The moving bar elicits anticipatory wave propagating faster than the bar.

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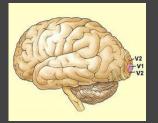




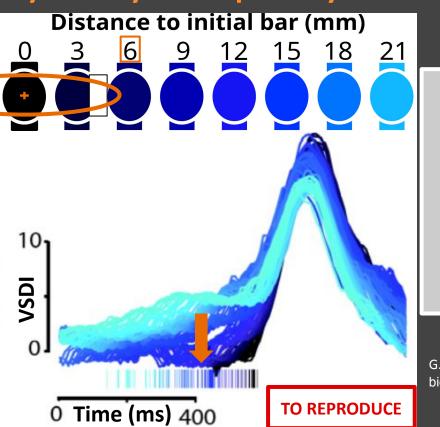
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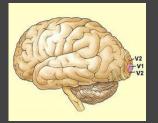




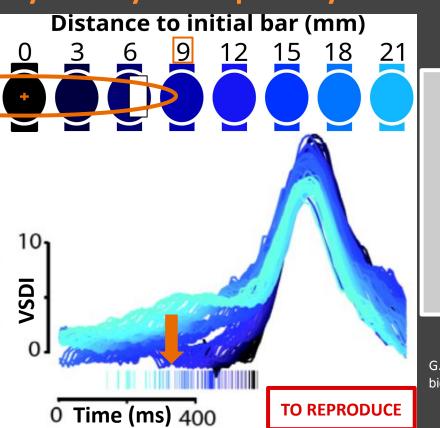
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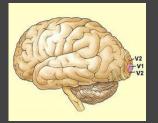




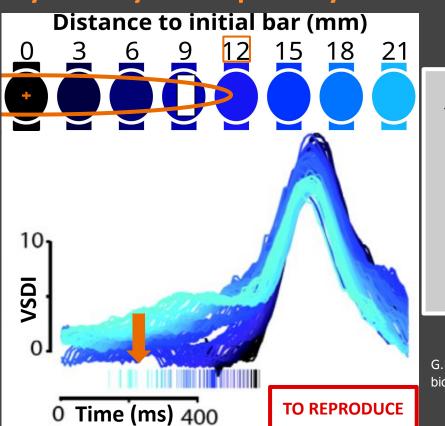
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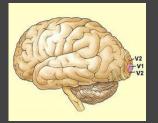




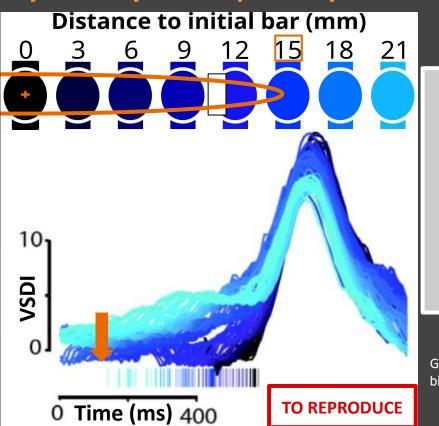
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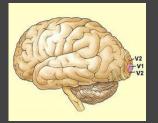




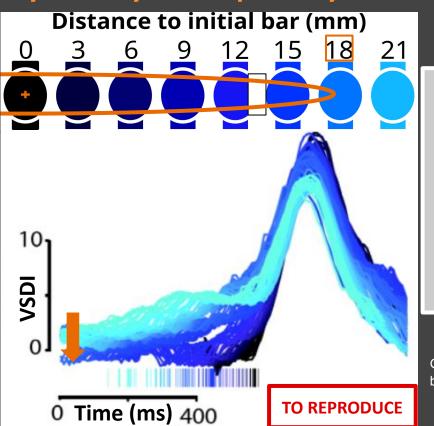
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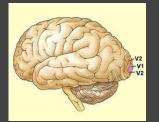




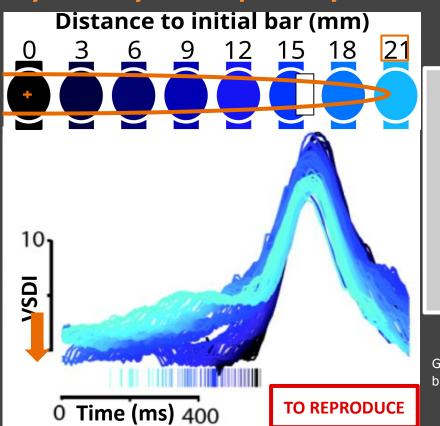
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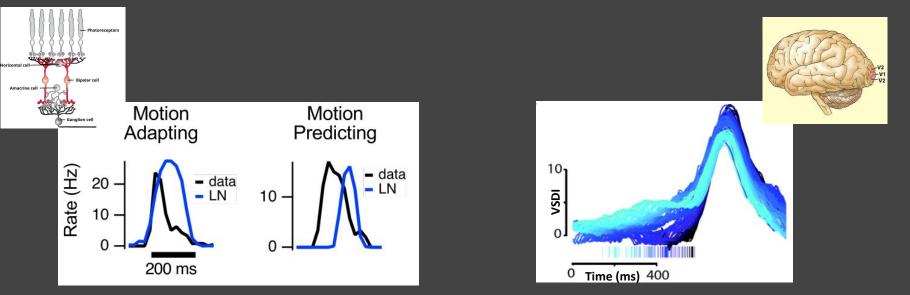




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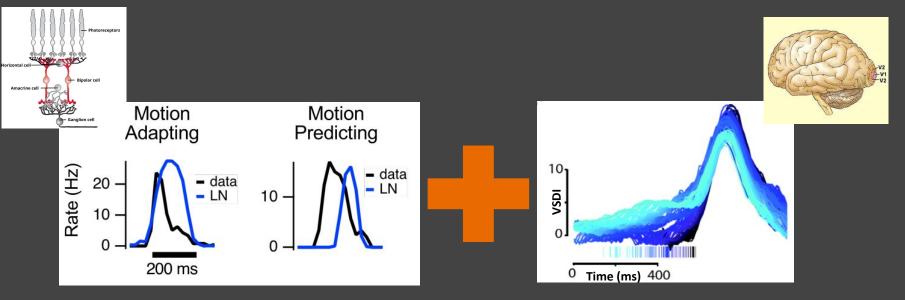
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## **Visual anticipation**



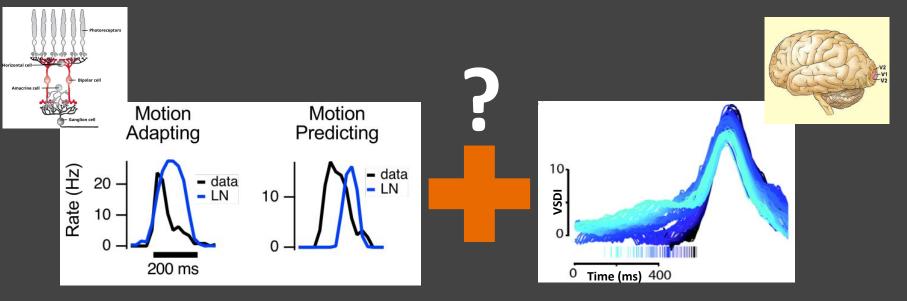
How do retinal and cortical anticipation interact?

## **Visual anticipation**



How do retinal and cortical anticipation interact?

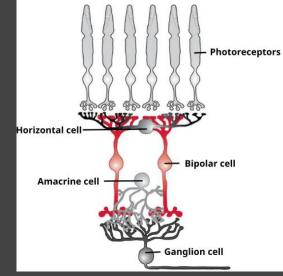
## **Visual anticipation**



How do retinal and cortical anticipation interact?

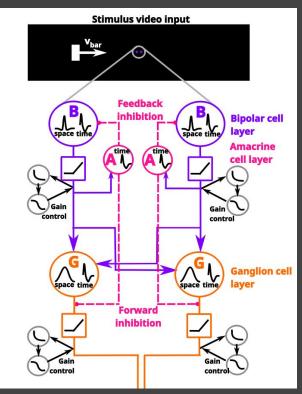
## Modelling retina network

#### Biological retinal architecture



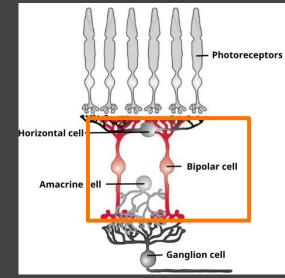
H.Shreyer, These (2018)

#### Retinal model architecture



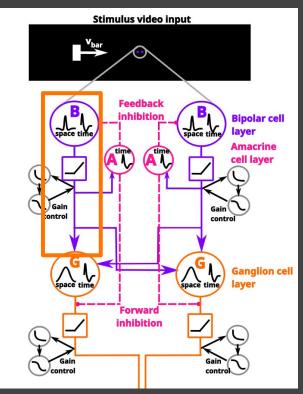
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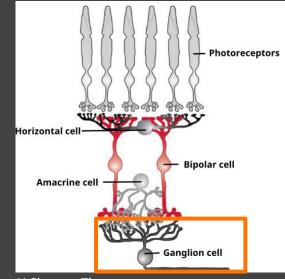
H.Shreyer, These (2018)

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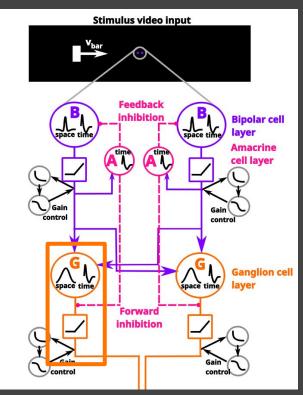
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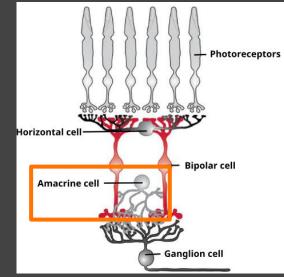
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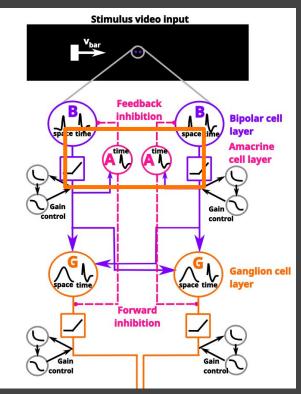
## Modelling retina network

#### Biological retinal architecture



H.Shreyer, These (2018)

#### Retinal model architecture



## Modelling retina network

#### Stimulus video input $\bigcirc$ Photoreceptors Feedback inhibition space time e time: spa Horizontal cell-Amacrine lateral connectivity Bipolar cell Amacrine cell )Gain control Ganglion cell space time H.Shreyer, These (2018)Forward inhibition

#### Retinal model architecture

Gain

control

**Bipolar cell** 

Amacrine cell laver

**Ganglion cell** 

laver

layer

Gain

Gain

control

control

## Modelling retina network

#### Bipolar equation

$$\frac{dV_{B_{i}}}{dt} = -\frac{1}{\tau_{B}}V_{B_{i}} + \sum_{j=1}^{N_{A}} W_{B_{i}}^{A_{j}} \mathcal{N}_{A}(V_{A_{j}}) + F_{B_{i}}(t),$$

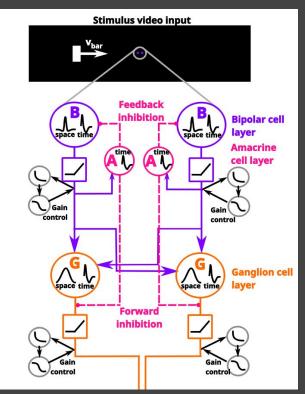
#### Amacrine equation

$$rac{dV_{A_{j}}}{dt} = -rac{1}{ au_{A}}V_{A_{j}} + \sum_{i=1}^{N_{B}}W_{A_{j}}^{B_{i}}\mathcal{N}_{B}(V_{B_{i}}),$$

#### Ganglion cell equation

$$\frac{dV_{G_k}}{dt} = -\frac{1}{\tau_G} V_{G_k} + \sum_{i=1}^{N_B} W_{G_k}^{B_i} \mathcal{N}_B(V_{B_i})$$
$$R_{G_k} = N_G(V_{G_k}) G_G(A_{B_i})$$

#### Retinal model architecture



S.Souihel, B.Cessac Journal of Mathematical Neuroscience, (2020)

## **Modelling retina network**

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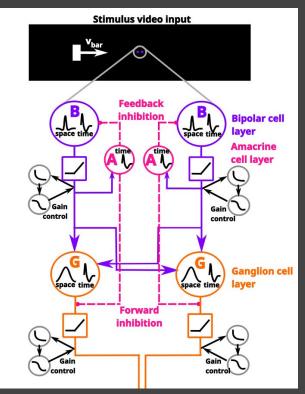
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#### Retinal model architecture



S.Souihel, B.Cessac Journal of Mathematical Neuroscience, (2020)

## Modelling retina network

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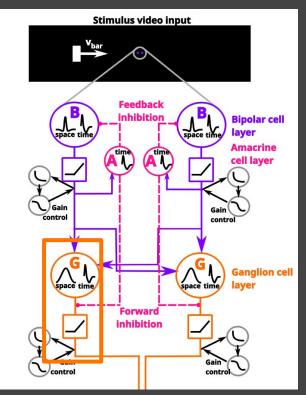
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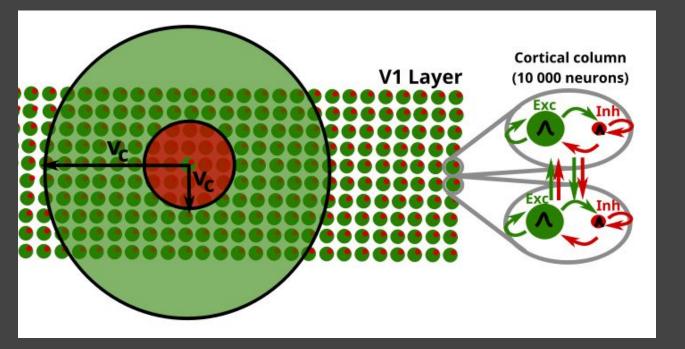
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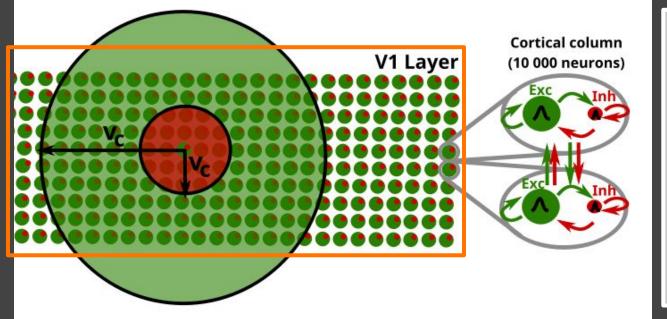


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## Modelling primary cortex network

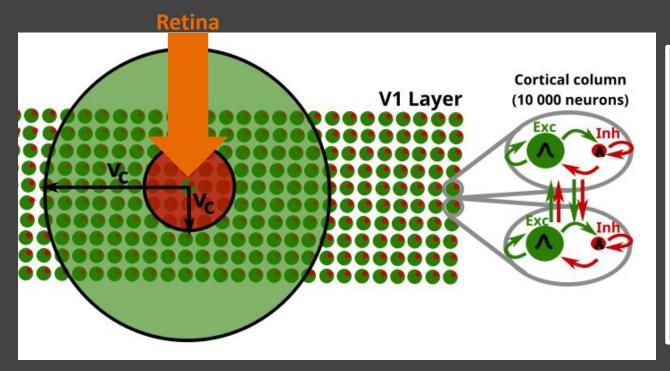


## **Modelling primary cortex network**



- Inspired from cortical column organisation.

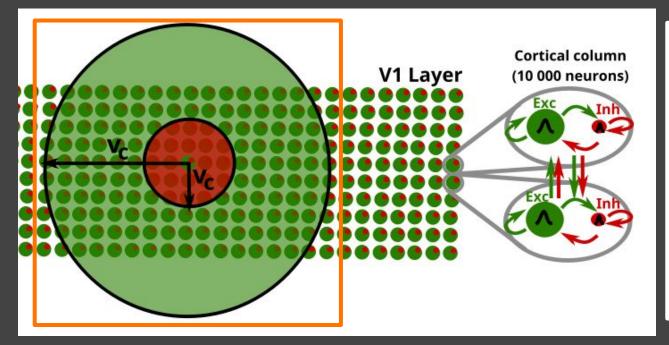
## **Modelling primary cortex network**



- Inspired from cortical column organisation.

### - Fed by our retinal input

## **Modelling primary cortex network**



- Inspired from cortical column organisation.

- Fed by our retinal input

 Lateral excitatory / inhibitory connectivity

# **Modelling primary cortex network**

$$\begin{split} \nu_e^{input}(x,t) &= \nu_e^{drive} + \int_{\mathbb{R}} dy \, \mathcal{N}_e(x-y) \, \nu_e(y,t-\|y-x\|/v_c) \\ \nu_i^{input}(x,t) &= \int_{\mathbb{R}} dy \, \mathcal{N}_i(x-y) \, \nu_i(y,t-\|y-x\|/v_c) \\ T \frac{\partial \nu_e(x,t)}{\partial t} &= -\nu_e(x,t) + \\ & \mathcal{F}_e(\nu_e^{aff}(x,t) + \nu_e^{input}(x,t), \nu_i^{input}(x,t)) \\ T \frac{\partial \nu_i(x,t)}{\partial t} &= -\nu_i(x,t) + \mathcal{F}_i(\nu_e^{input}(x,t), \nu_i^{input}(x,t)) \\ \mu_V(\nu_e,\nu_i) &= \frac{\mu_{Ge} \, E_e + \mu_{Gi} \, E_i + g_L \, E_L}{\mu_G} \\ VSDI &= \frac{\mu_V - \mu_{V0}}{\mu_{V0}} \end{split}$$

Y. Zerlaut, S. Chemla, F. Chavane, A. Destexhe bioRxiv, (2017)

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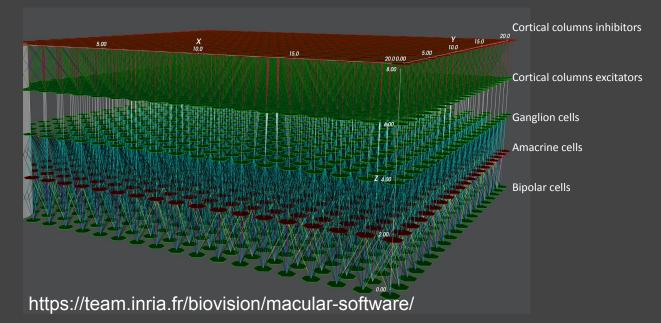
Y. Zerlaut, S. Chemla, F. Chavane, A. Destexhe bioRxiv, (2017)

# **Modelling primary cortex network**

$$\begin{split} \nu_e^{input}(x,t) &= \nu_e^{drive} + \int_{\mathbb{R}} dy \, \mathcal{N}_e(x-y) \, \nu_e(y,t-\|y-x\|/v_c) \\ \nu_i^{input}(x,t) &= \int_{\mathbb{R}} dy \, \mathcal{N}_i(x-y) \, \nu_i(y,t-\|y-x\|/v_c) \\ T \frac{\partial \nu_e(x,t)}{\partial t} &= -\nu_e(x,t) + \\ \mathcal{F}_e(\nu_e^{aff}(x,t) + \nu_e^{input}(x,t), \nu_i^{input}(x,t)) \\ T \frac{\partial \nu_i(x,t)}{\partial t} &= -\nu_i(x,t) + \mathcal{F}_i(\nu_e^{input}(x,t), \nu_i^{input}(x,t)) \\ \mu_V(\nu_e,\nu_i) &= \frac{\mu_{Ge} \, E_e + \mu_{Gi} \, E_i + g_L \, E_L}{\mu_G} \\ \hline VSDI = \frac{\mu_V - \mu_{V0}}{\mu_{V0}} \end{split}$$

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## Macular software



Implementation of the retino-cortical model in a network simulation software called Macular

### Results



## **Reproduction** of the biological cortical latency experiment

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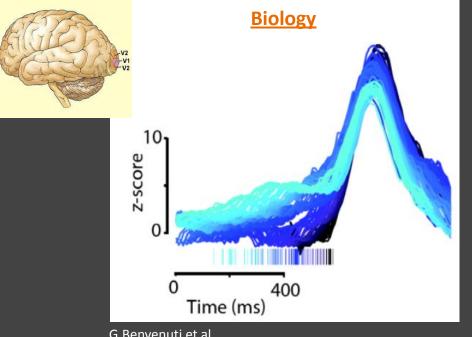
## Effect of adapting anticipation on the cortical anticipation.

## **Reproduction** of the biological cortical latency experiment

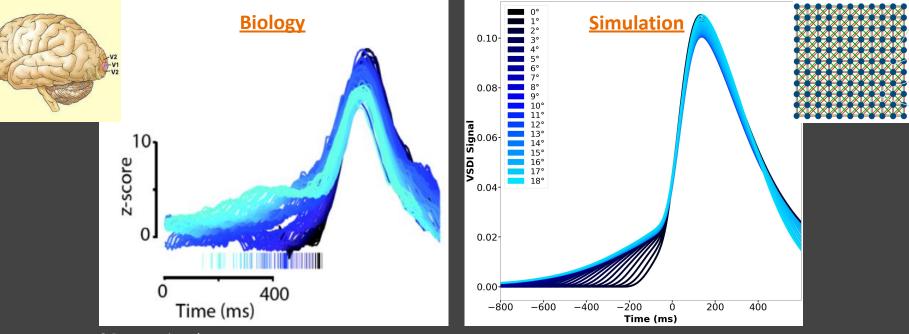
### Effect of adapting anticipation on the cortical anticipation.

Effect of **predicting anticipation** on the cortical anticipation.

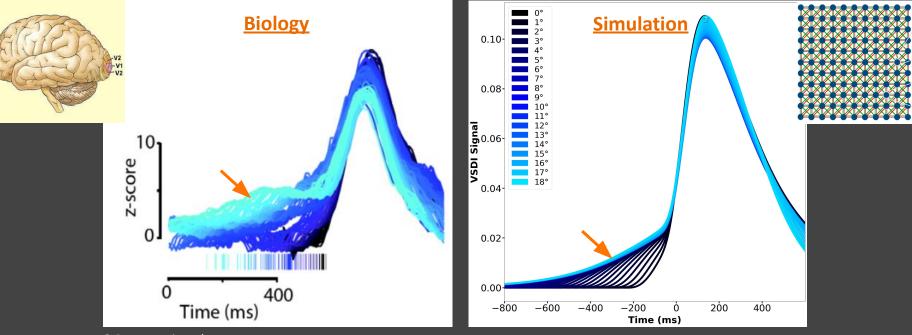
## Can our retino-cortical model reproduce experimental data?



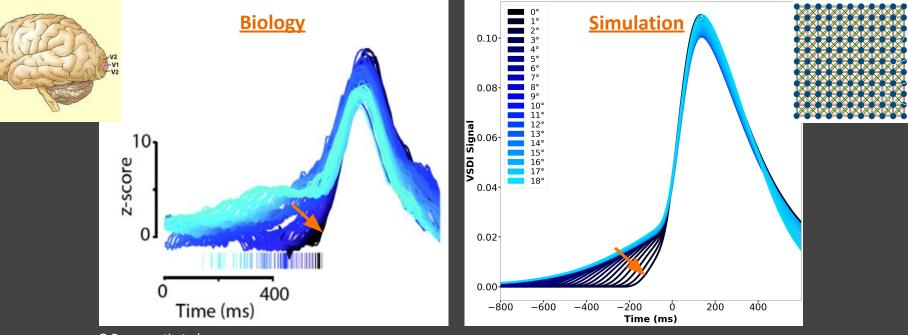
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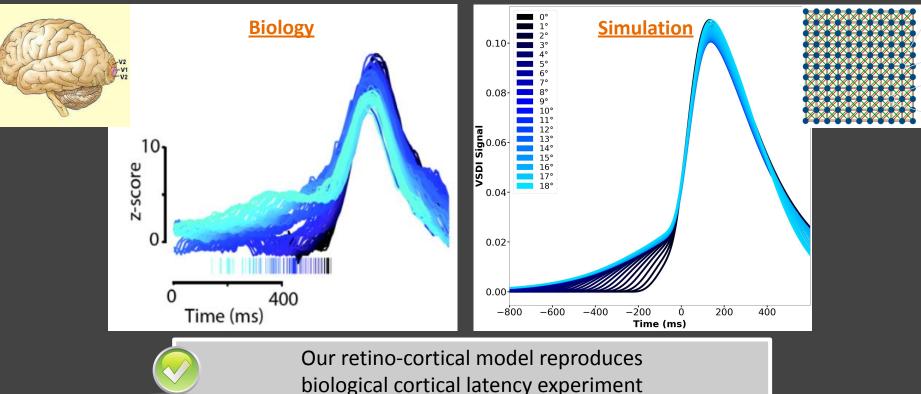
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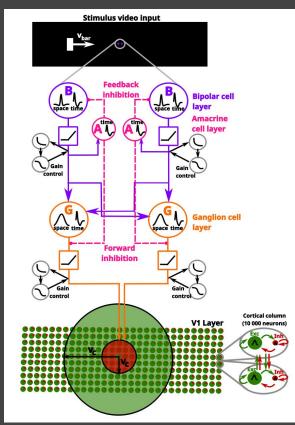
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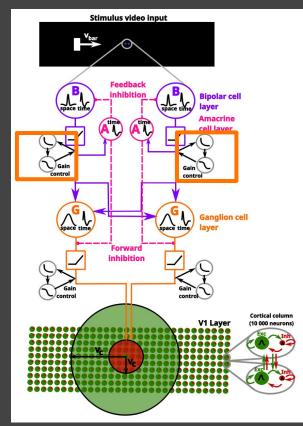
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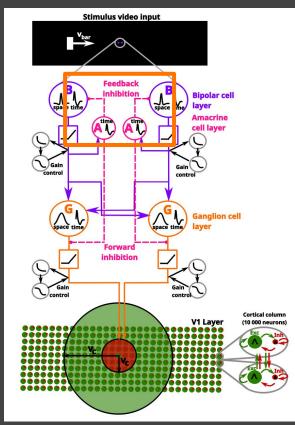
## How to model bipolar adapting anticipation?



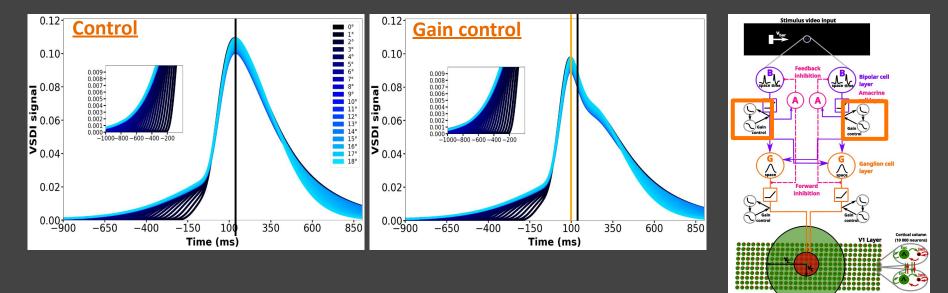
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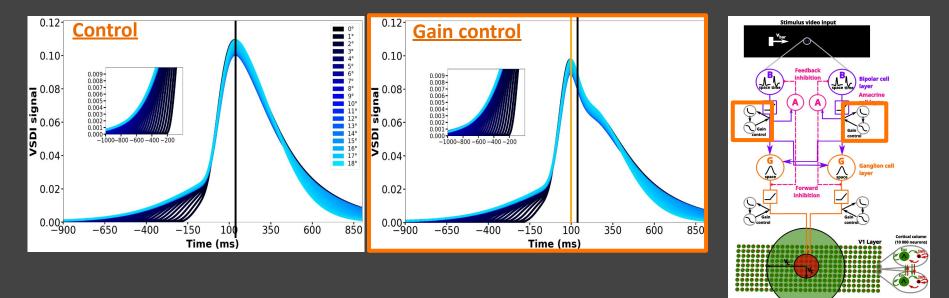
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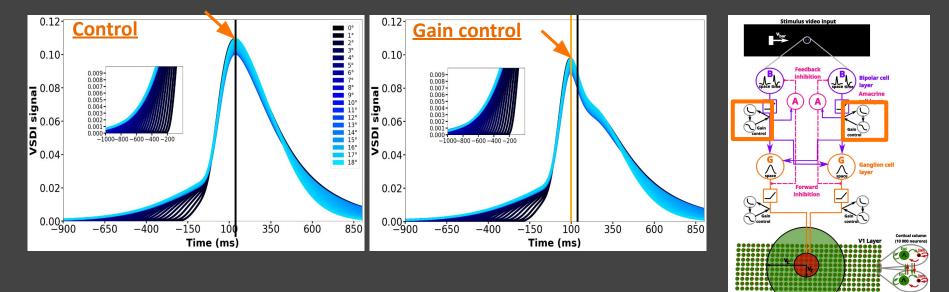
### **Does bipolar gain control influence cortical anticipation?**



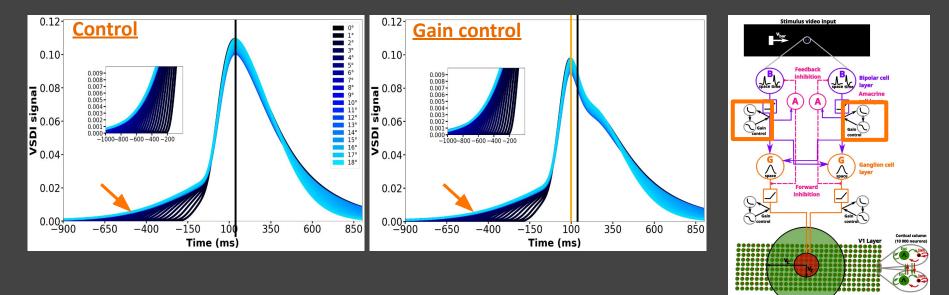
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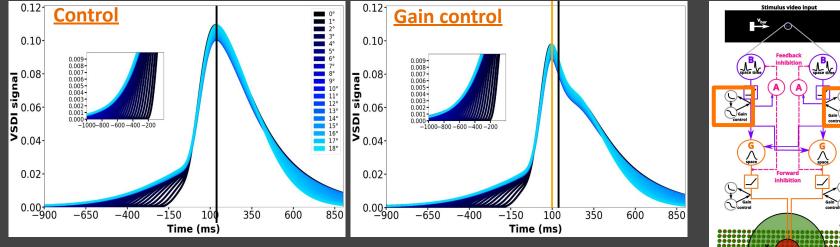
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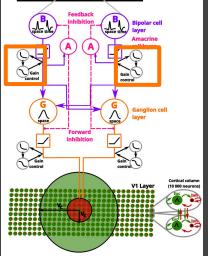
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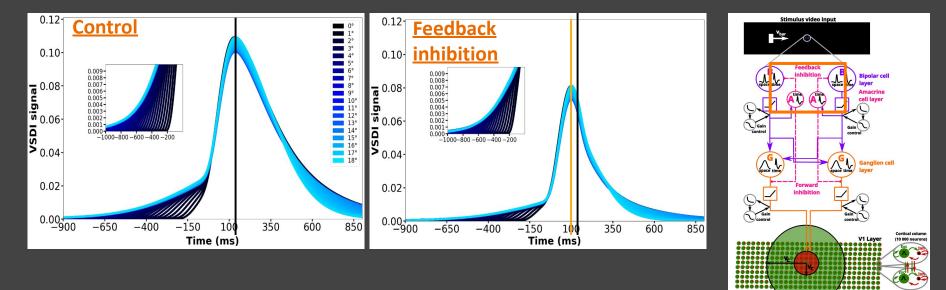


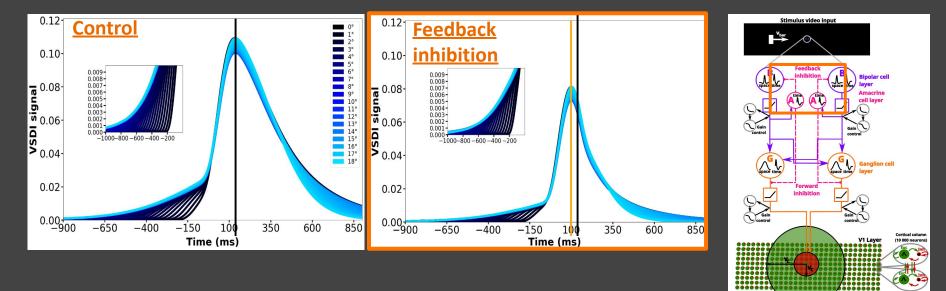
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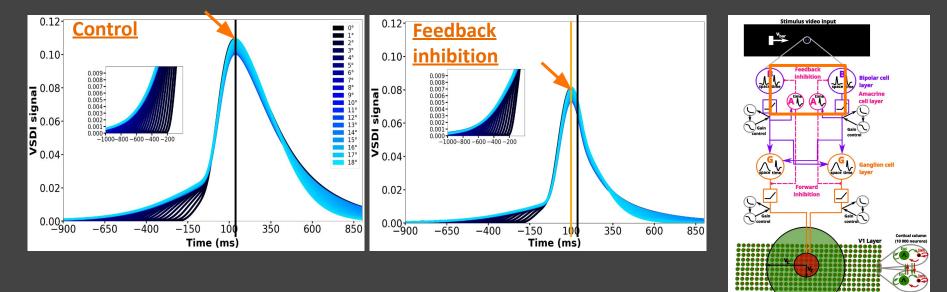


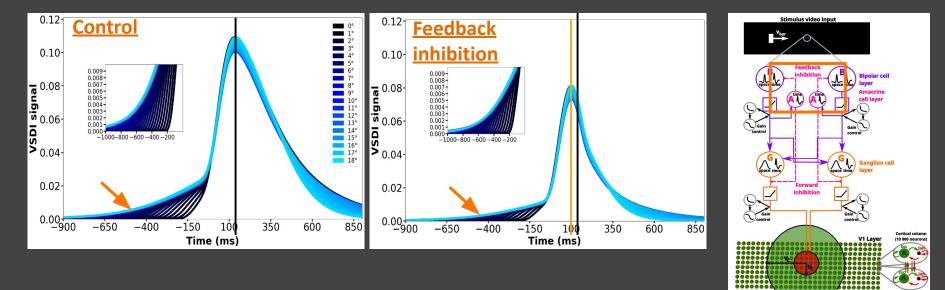
Bipolar gain control causes adapting anticipation in the cortex without affecting cortical anticipation.



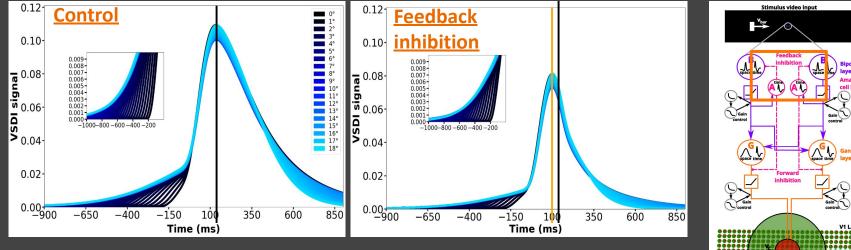




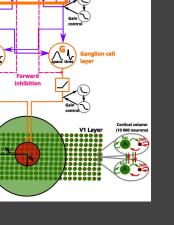




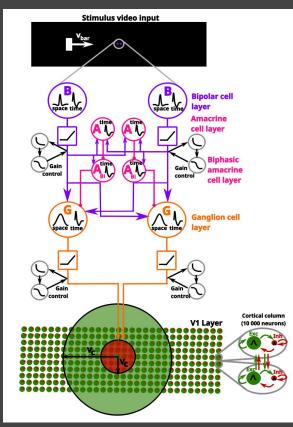
# **Does feedback inhibition influence cortical anticipation?**



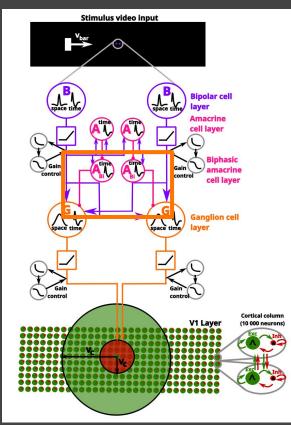
Amacrine feedback inhibition generates adapting anticipation in the cortex but disturb cortical anticipation

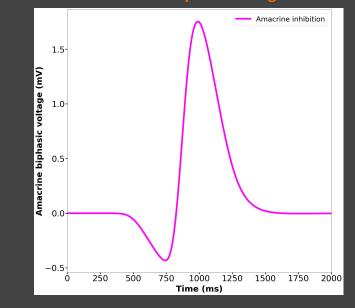


# How to model retinal predicting anticipation?



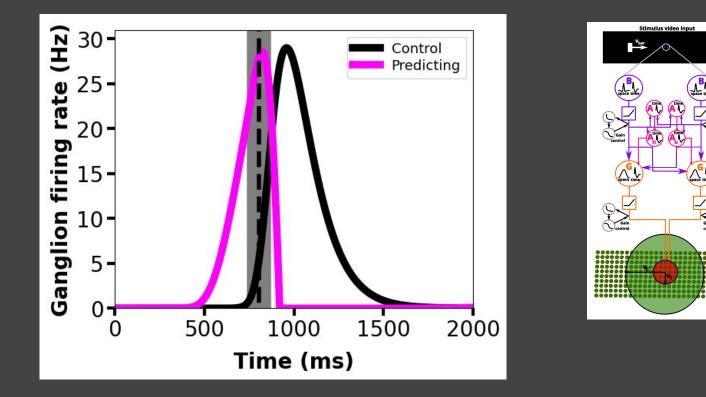
# How to model retinal predicting anticipation?





#### Amacrine bipolar voltage

# **Does amacrine biphasic connectivity create predicting anticipation?**

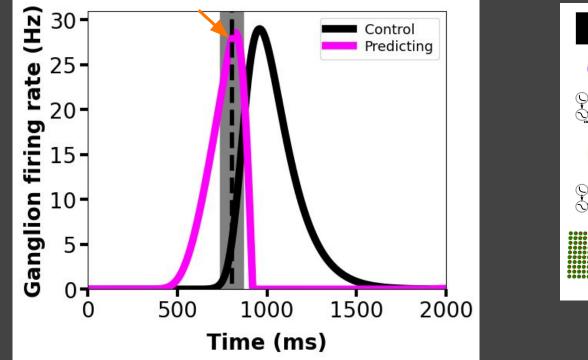


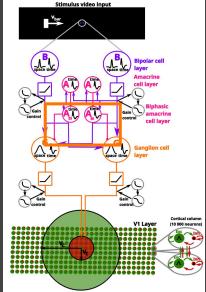
ortical colum

10 000 neuron

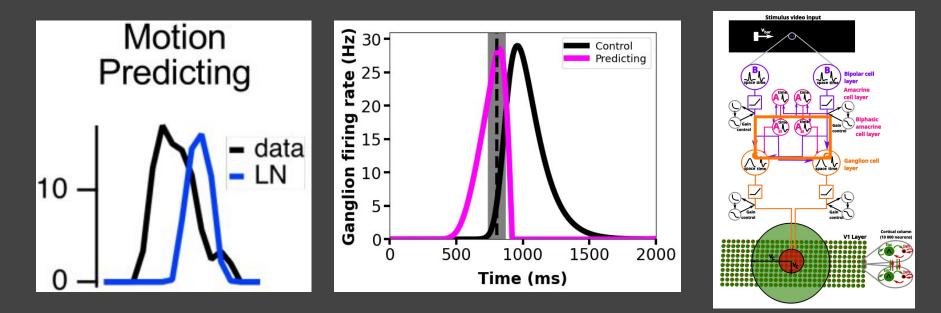
V1 Lav

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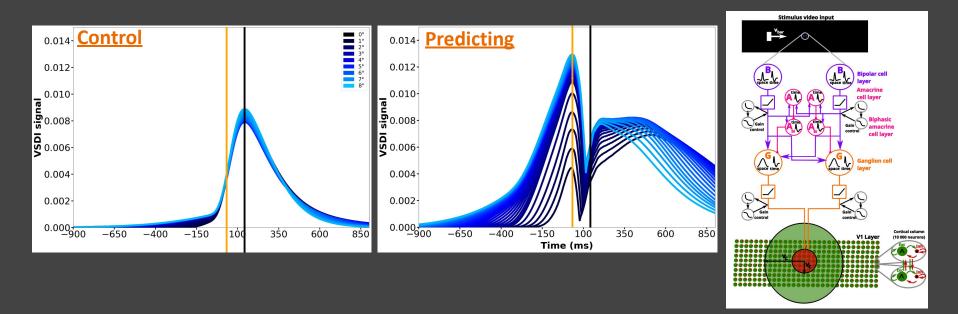




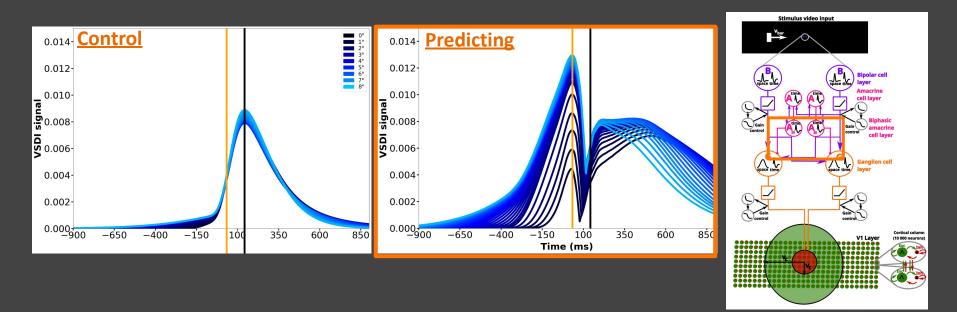
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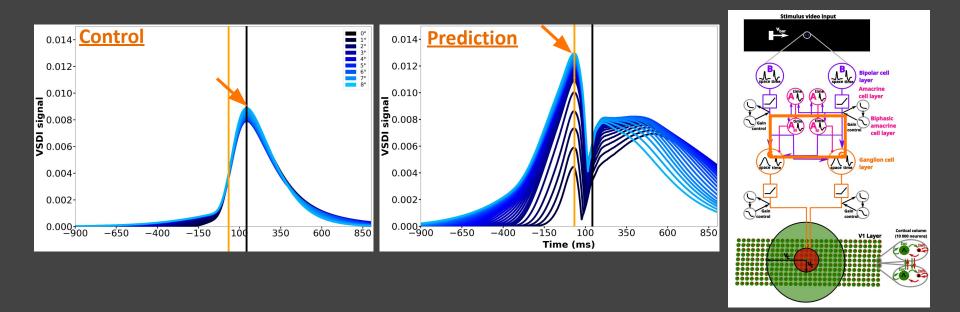


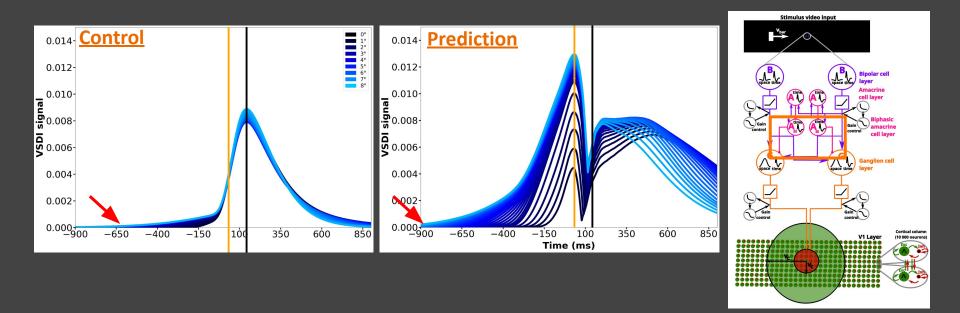
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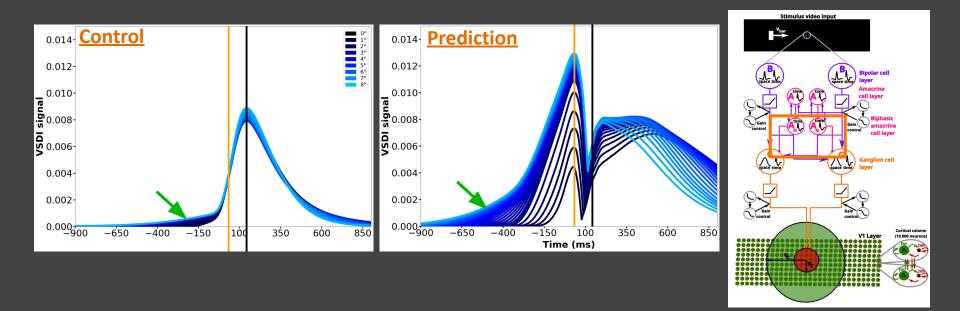


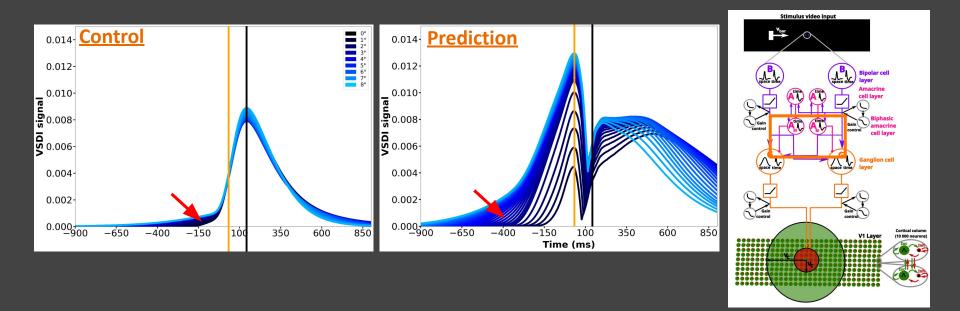
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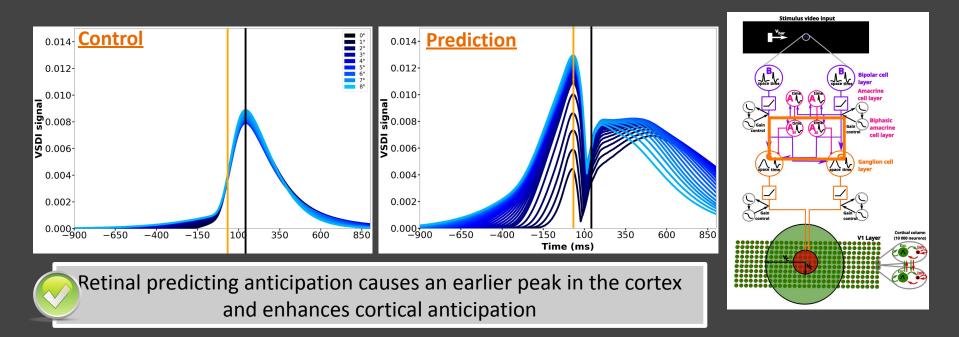








#### Prediction



# How to study visual anticipation in a retino cortical pathway model?

#### **Implementation** :

- The retino-cortical model is **implemented** in a network simulation software.

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#### **<u>Reproduction</u>** :

- The retino-cortical model **reproduces** biological cortical latency experiment

# Predictions :

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- **Complementary effect** between adaptive and predictive anticipation ?

- Studying retino-cortical model in a easy-to-use software

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- Exploring retinal and cortical anticipation in the retino-cortical pathway.
- Extending it to the understand of other visual phenomena (saccades...).

# Thank you for your attention !

**Bruno Cessac Alain Destexhe** Matteo Di Volo Frédéric Chavane Olivier Marre Mark Wexler Pierre Kornprobst Hui-Yin Wu Simone Ebert Johanna Delachambre Franz Franco Gallo Florent Robert Clément Bergman Sebastian Gallardo Diaz Erwan Petit Sebastian Vizcay

