



## Is your gaze your aim?

Eye position in reward gambling and the  
role of orbito-frontal cortex in encoding  
the value of visually cued offers

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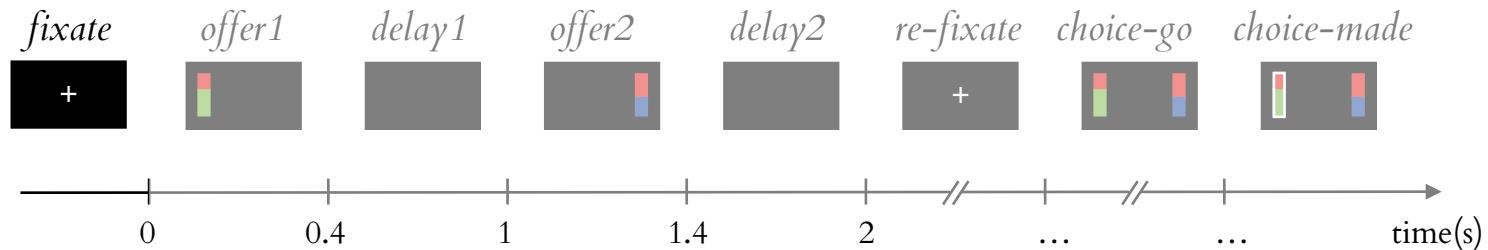
<sup>1</sup>Center for Brain and Cognition (CBC), Universitat Pompeu Fabra (UPF), 08002, Barcelona – ES;

<sup>2</sup>Department of Information and Communication Technologies, Universitat Pompeu Fabra (UPF), 08002, Barcelona – ES;

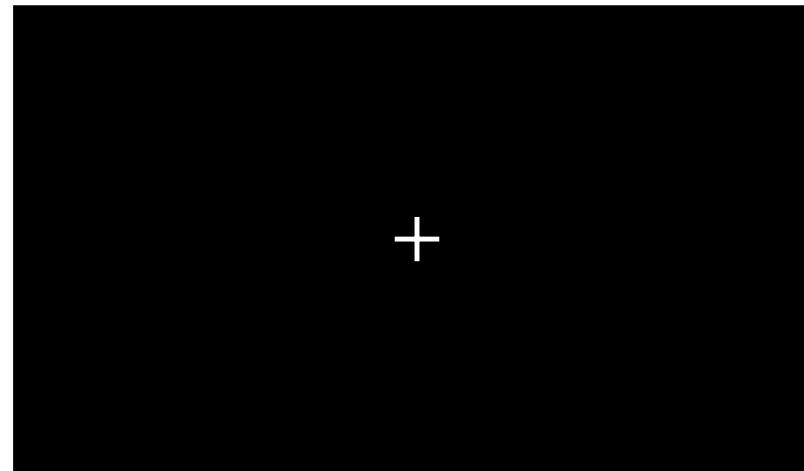
<sup>3</sup>Dept. of Neuroscience, Center for Magnetic Resonance Research, Center for Neuroeng., University of Minnesota, MN55455, Minneapolis – USA;

\*[demetrio.ferro@upf.edu](mailto:demetrio.ferro@upf.edu)

# Reward gambling task

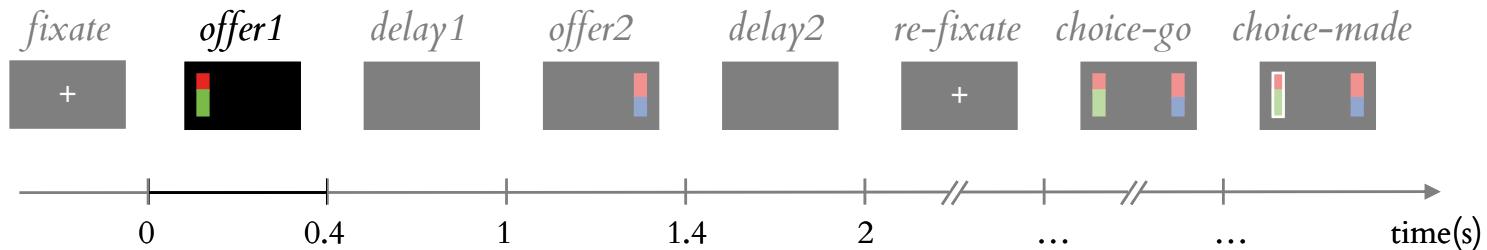


**Fixate**



acquire fixation at center of the screen

# Reward gambling task

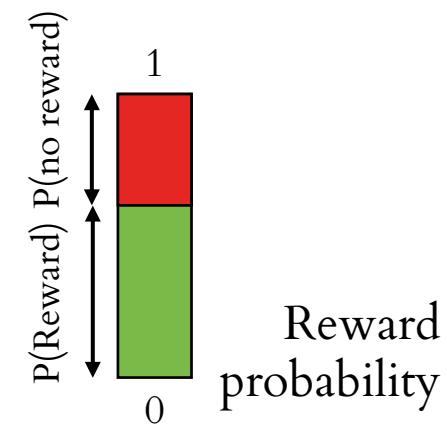


Offer 1



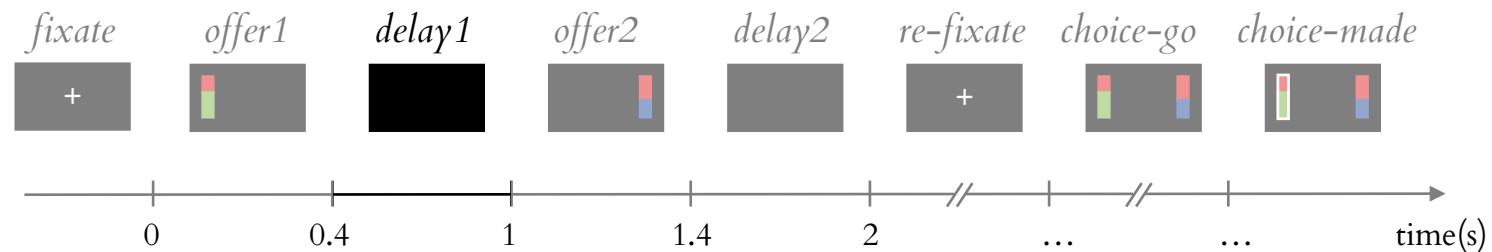
Reward magnitude      L      M      S      0  
first offer is presented

Below the bars are three blue water droplet icons, corresponding to L, M, and S.

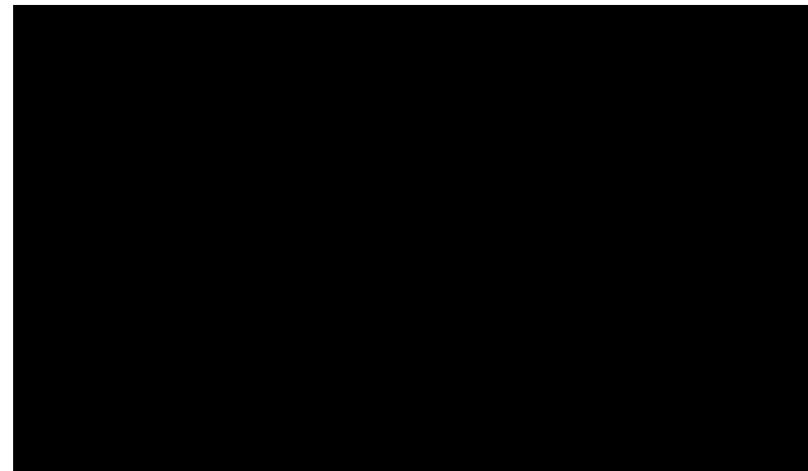


Reward probability

# Reward gambling task

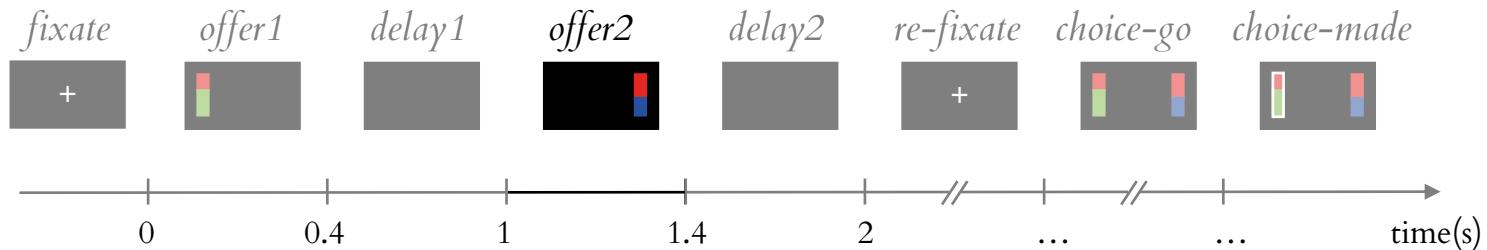


Delay 1

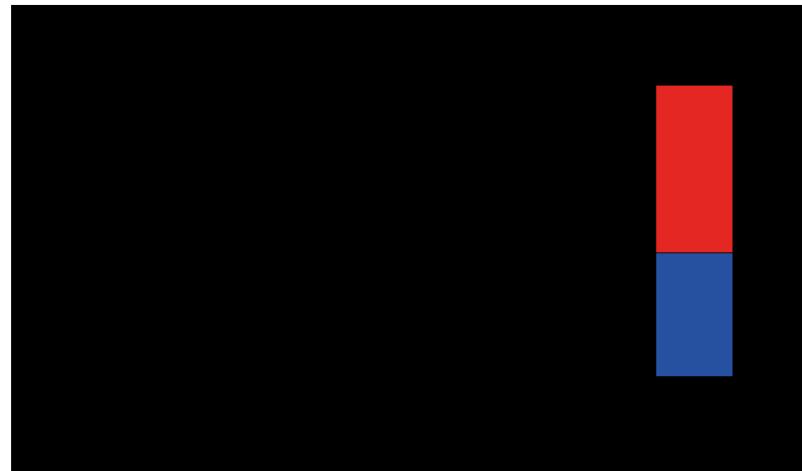


blank screen

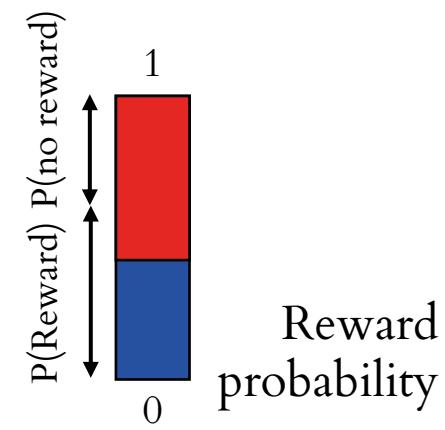
# Reward gambling task



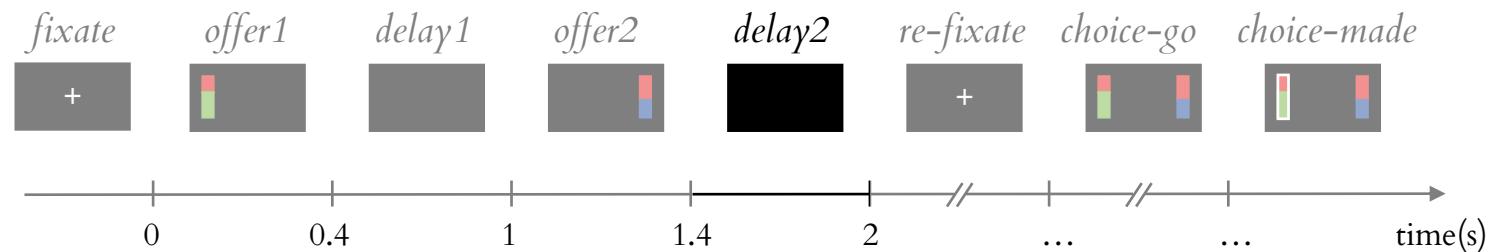
Offer 2



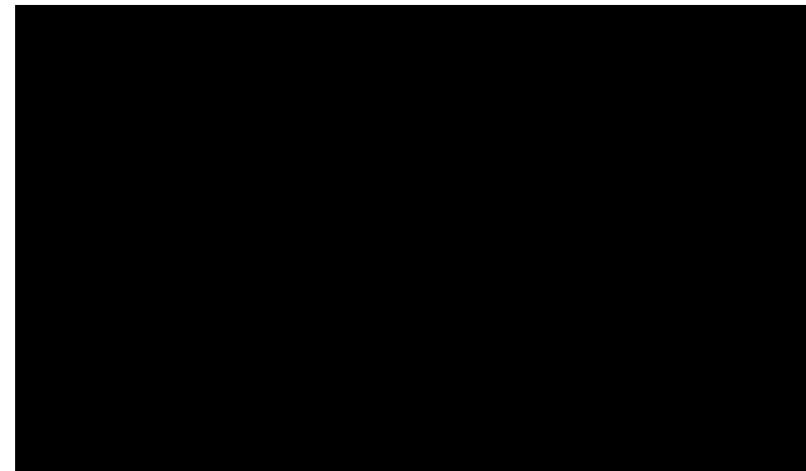
Reward magnitude      L      M      S      0  
second offer is presented



# Reward gambling task

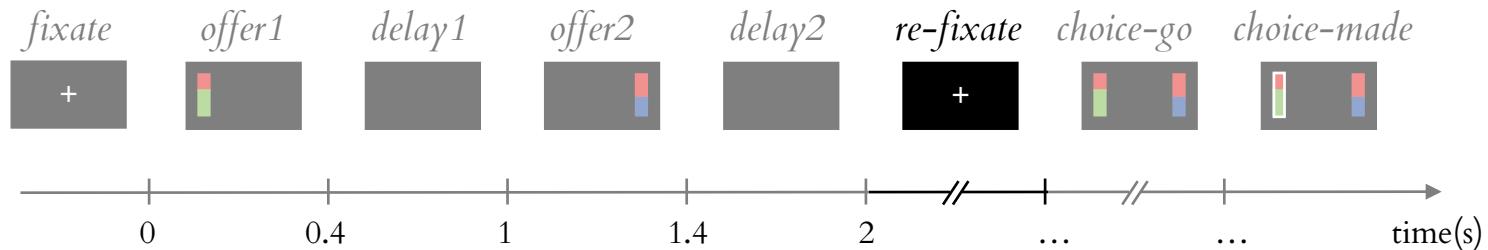


Delay 2

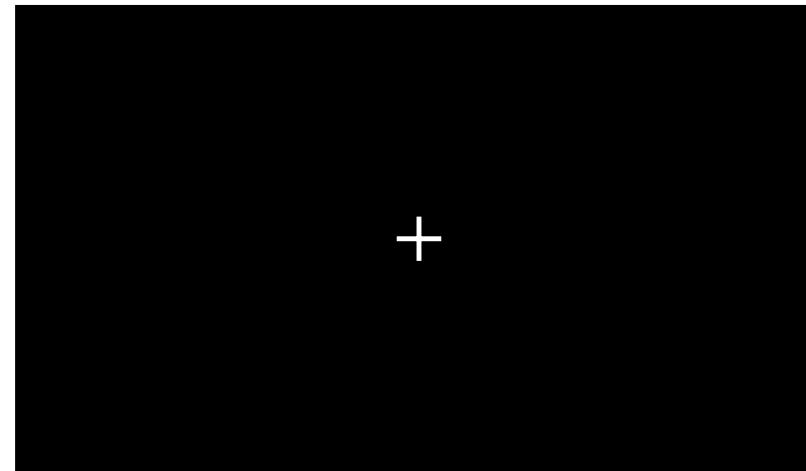


blank screen

# Reward gambling task

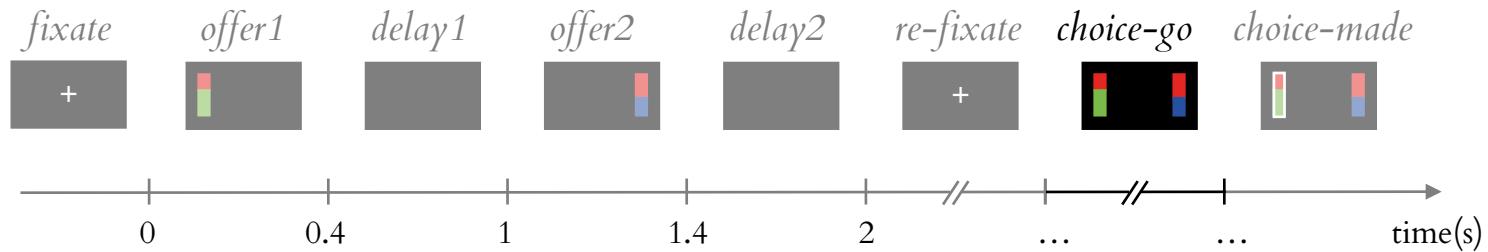


Re-fixate



re-acquire fixation at center of the screen

# Reward gambling task

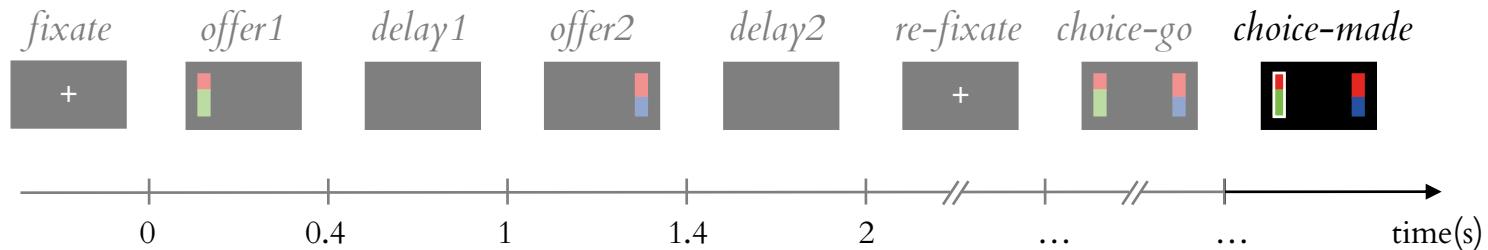


## Choice-go



saccade to chosen offer side

# Reward gambling task

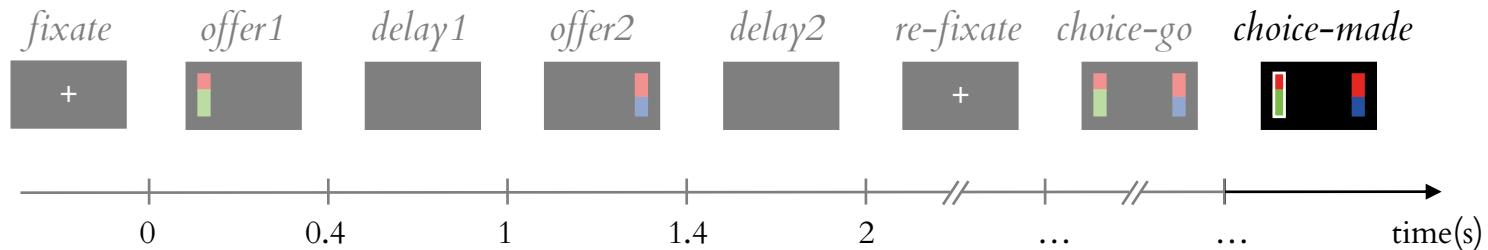


**Choice-made**



hold chosen offer side for at least +200ms

# Reward gambling task



Reward



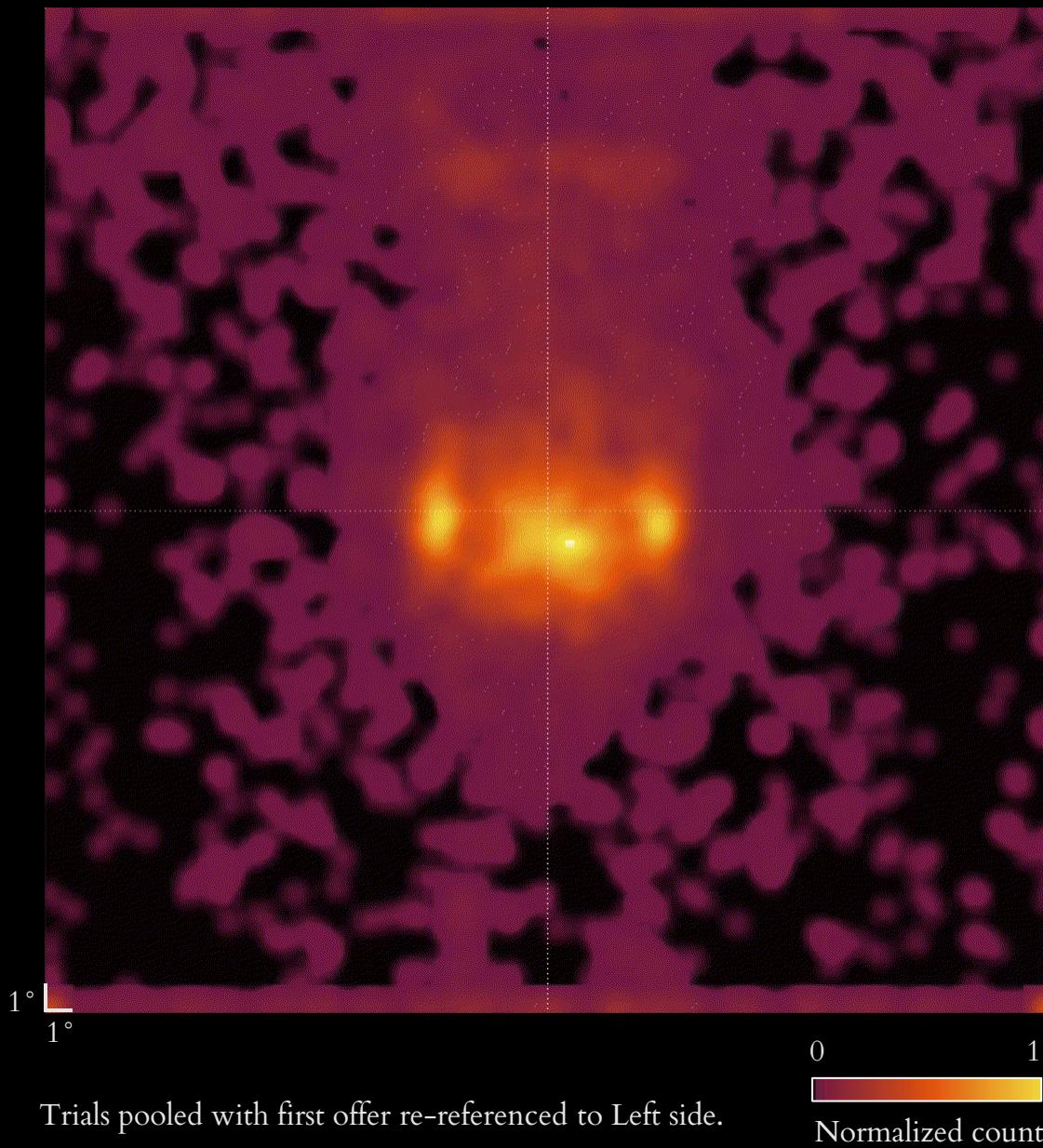
reward is provided



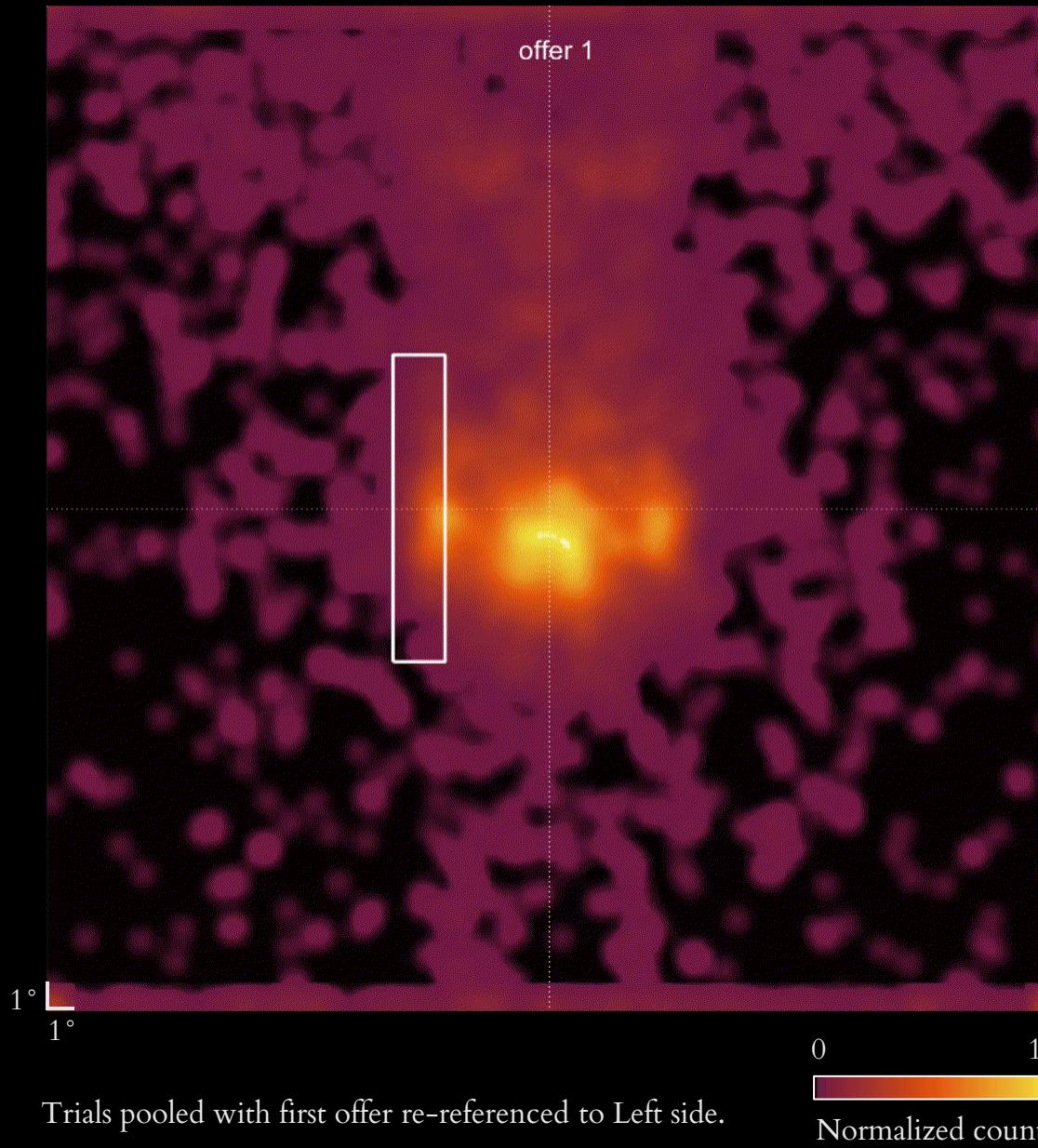
# Motivations

- Is the gaze position relevant for the reward gambling task execution?
- Can we use the gaze position as a marker of what is the animal mentally picturing during task execution in, particular during delay times?

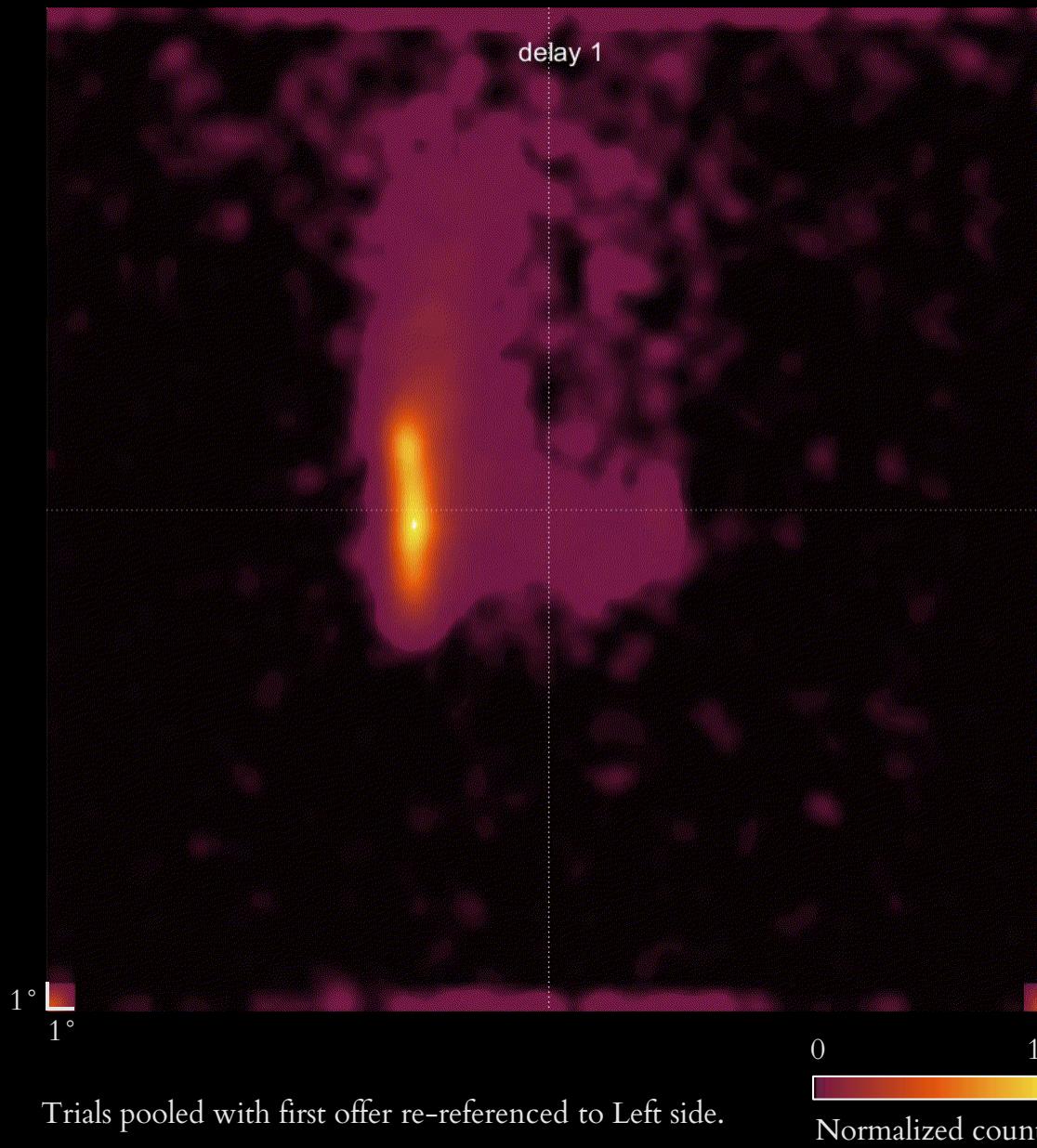
# Eye movements during task execution



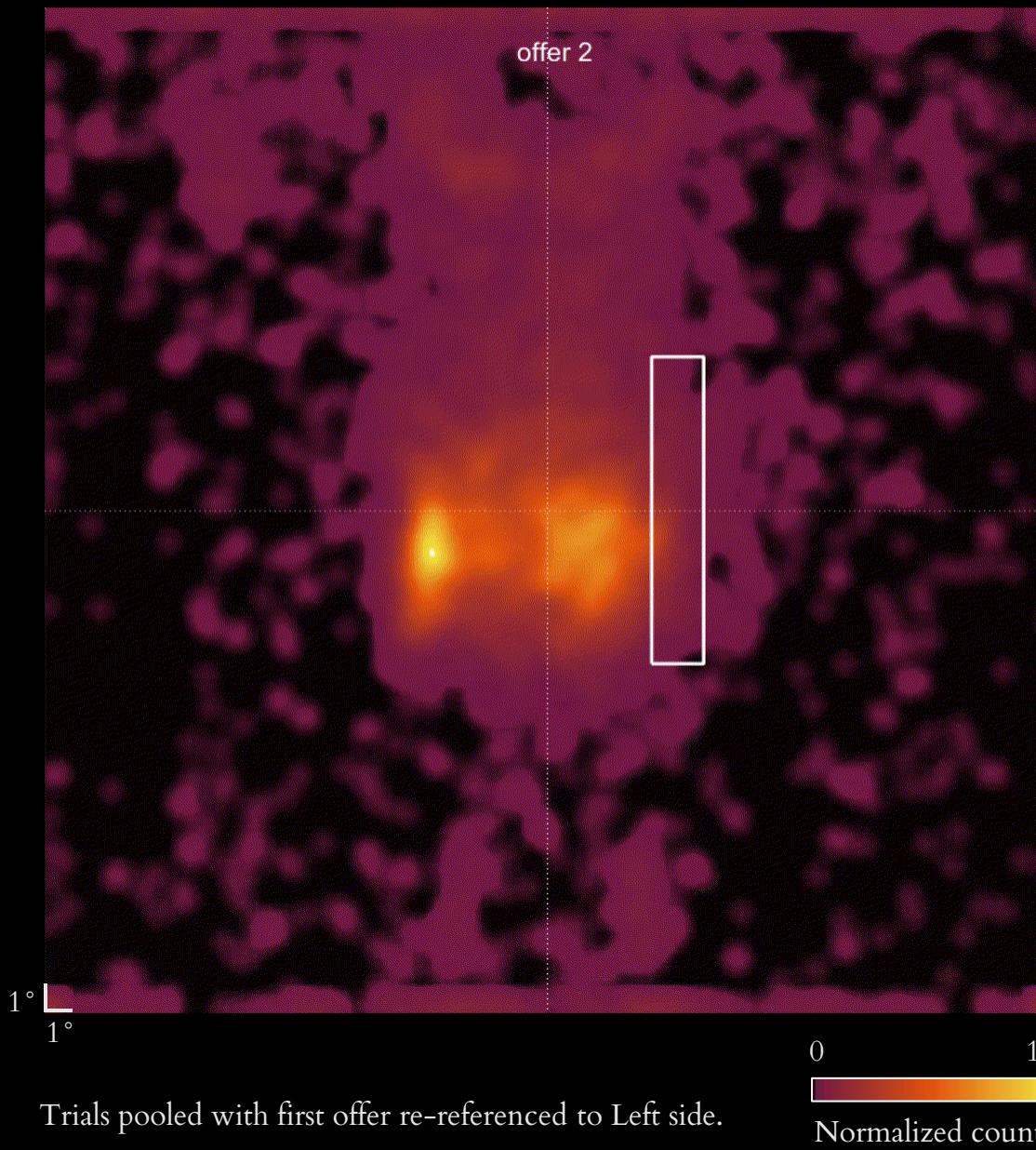
# Eye movements during task execution



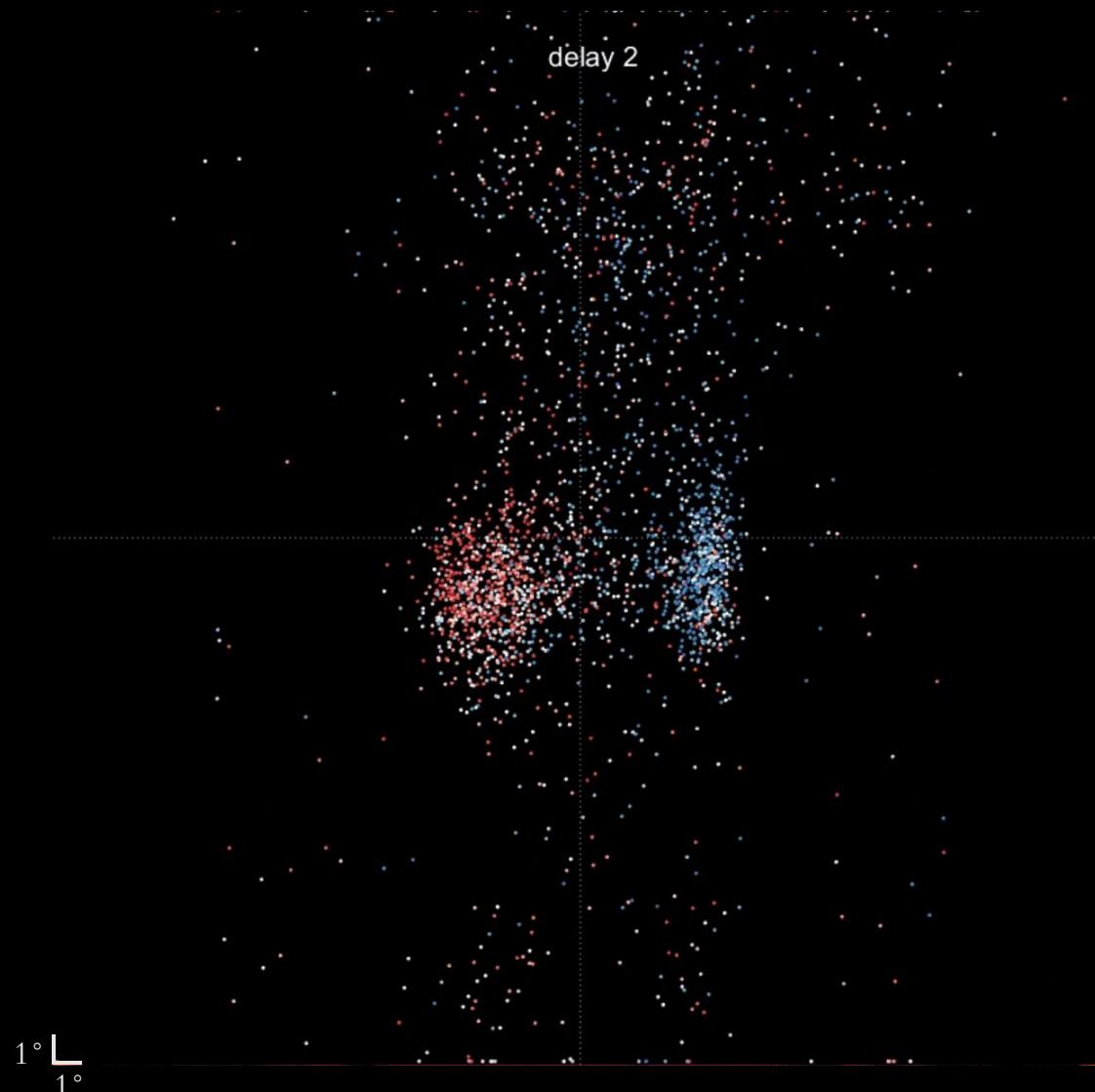
# Eye movements during task execution



# Eye movements during task execution



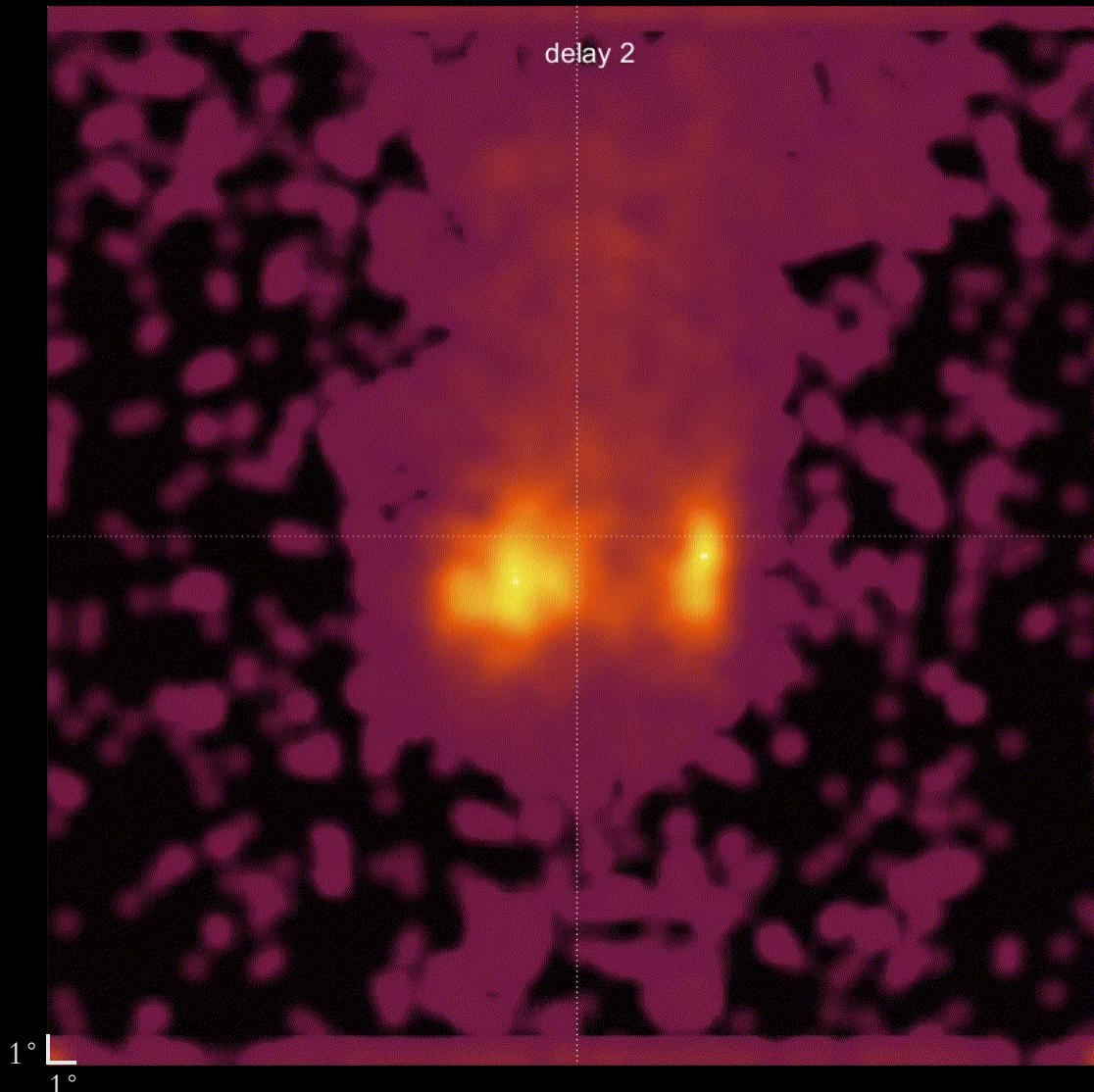
# Eye movements during task execution



Trials pooled with first offer re-referenced to Left side.

- Left is best,  $E(\text{Left}) > E(\text{Right})$
- Right is best,  $E(\text{Right}) > E(\text{Left})$

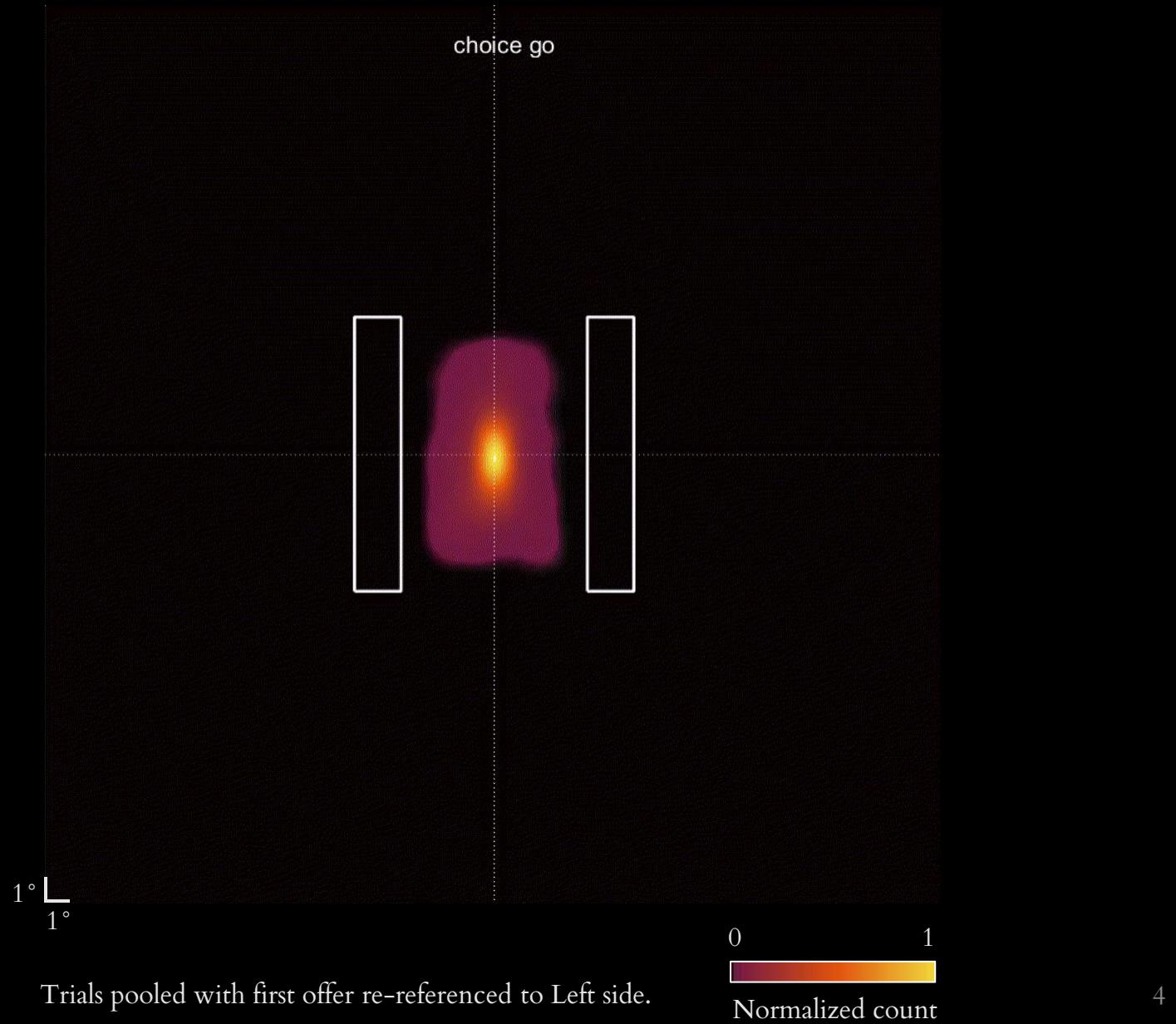
# Eye movements during task execution

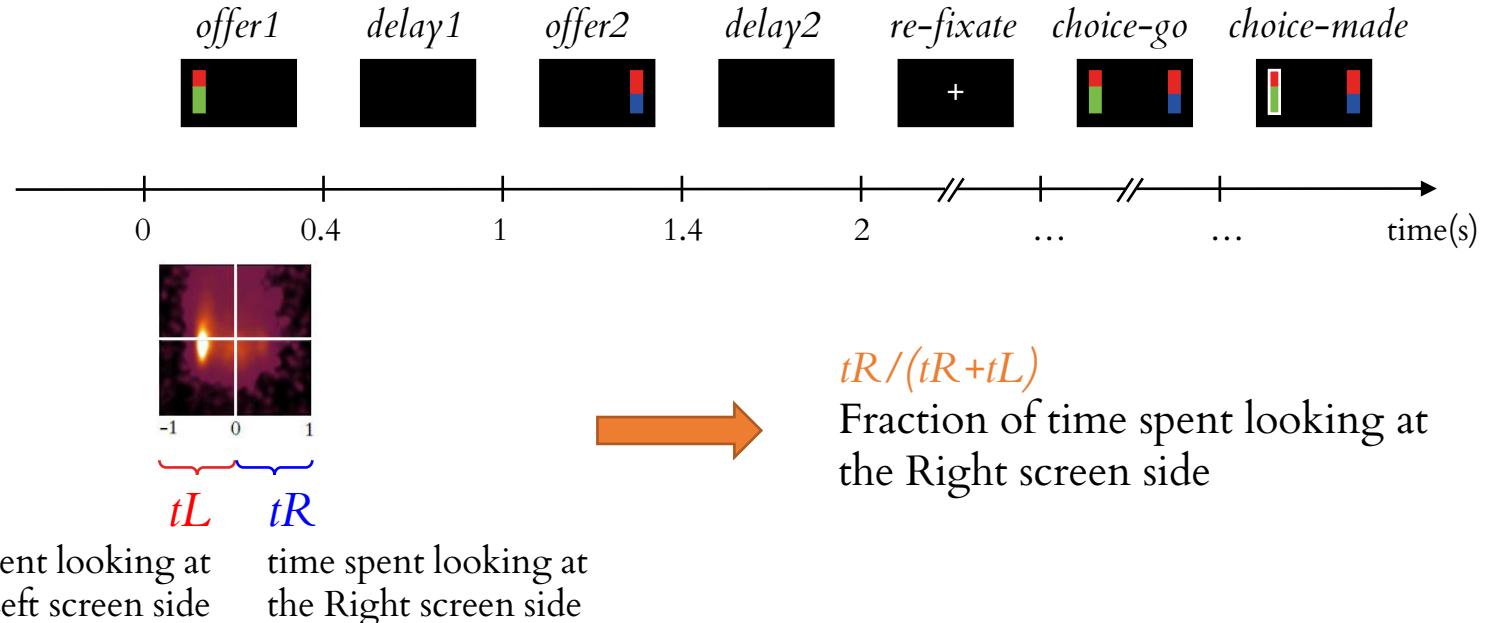


Trials pooled with first offer re-referenced to Left side.

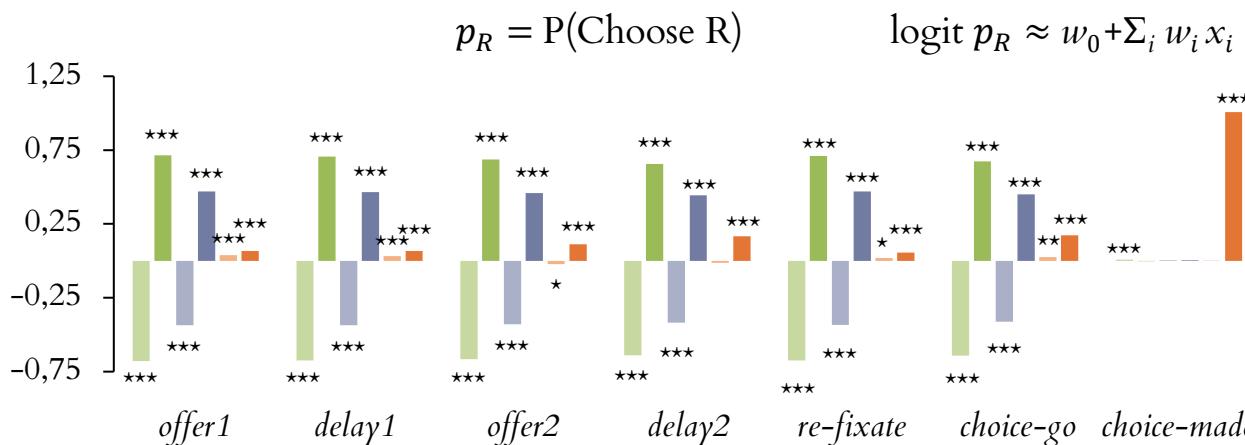
Normalized count

# Eye movements during task execution



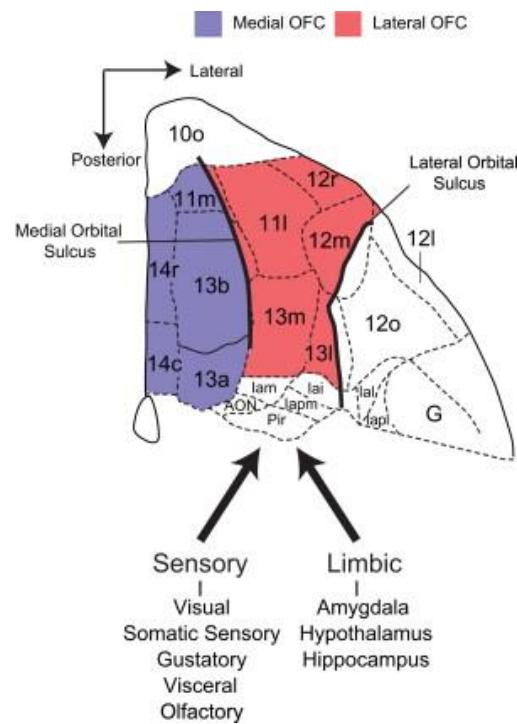


## Generalized Linear Model (GLM) for behavioral choice



$x_1, w_1$ , Left offer EV  
 $x_2, w_2$ , Right offer EV  
 $x_3, w_3$ , Left offer VAR  
 $x_4, w_4$ , Right offer VAR  
 $x_5, w_5$ , order 1stL=1  
 $x_6, w_6$ ,  $tR/(tR+tL)$

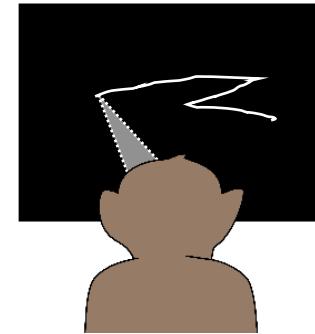
# Neural Data



Carmichael, S.T., and Price, J.L. (1994). *Architectonic subdivision of the orbital and medial prefrontal cortex in the macaque monkey*. J. Comp. Neurol. 346, 366–402.

## Subject 1

area	session	#cells	# trials
BA13	12/07/17	51	643
BA13	12/08/17	59	700
BA11	12/09/17	24	697
BA11	12/10/17	29	603
Total		163	2643



## Subject 2

area	session	#cells	# trials
BA11	3/06/19	18	1015
BA11	3/07/19	32	323
BA11	3/08/19	9	1084
BA11	3/11/19	26	906
total		85	3328

- 2 Subjects
- 8 Sessions
- 248 Cells

## Data acquisition



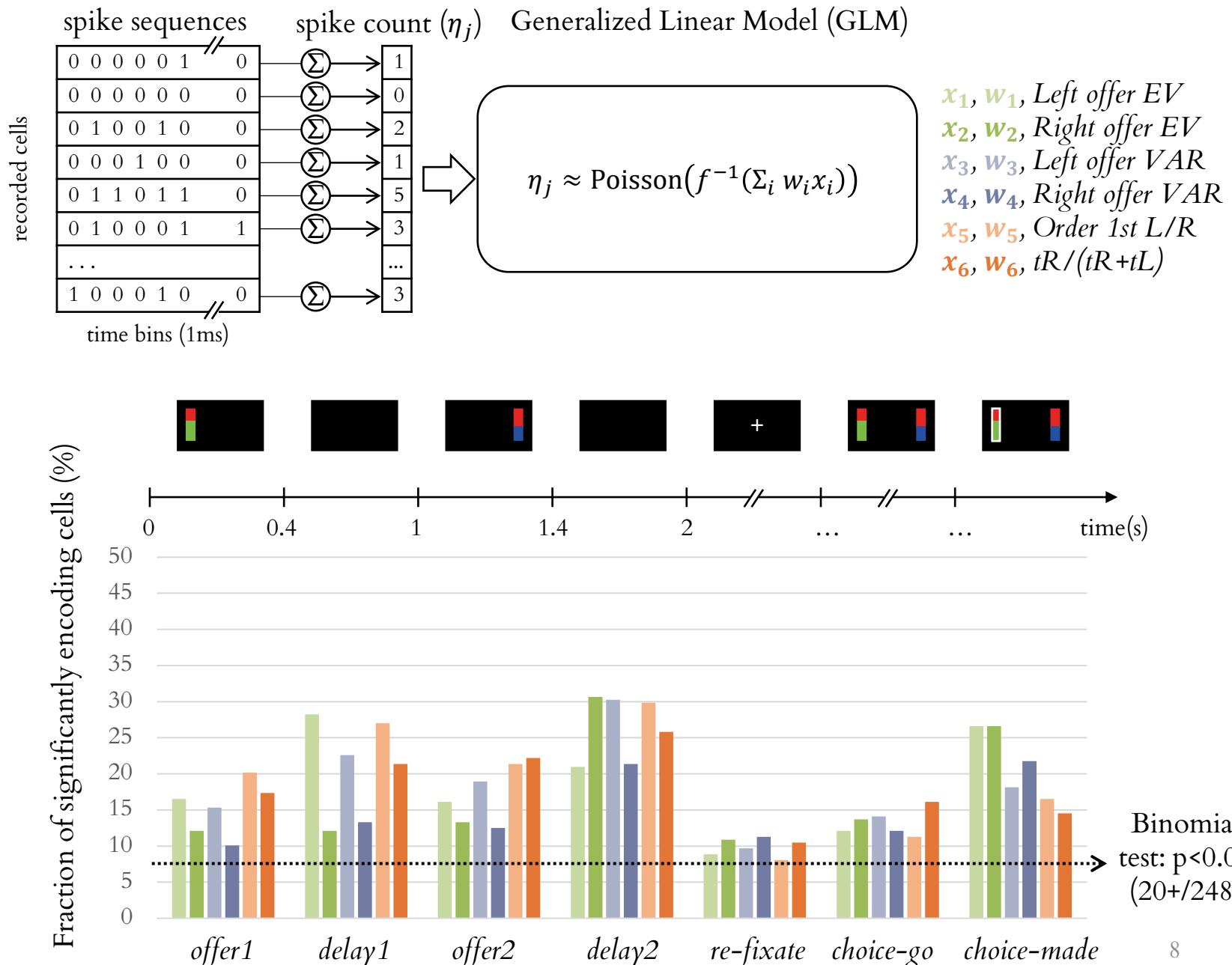
Tyler Cash-Padgett, Maya Zhe Wang, Benjamin Hayden,  
Hayden Lab, Dept. of Neuroscience, Center for Magnetic Resonance Research,  
Center for Neuroengineering, University of Minnesota, Minneapolis, USA;

Two adult male rhesus macaques (*macaca mulatta*) served as experimental subjects. All procedures were approved by the University Committee on Animal Resources at the University of Rochester and at the University of Minnesota, conducted in compliance with the Public Health Service's Guide for the Care and Use of the Animals.

# Motivations

- Are task-relevant variables encoded by OFC cells?
- Is the gaze position relevant in the neural process of encoding the offer values?

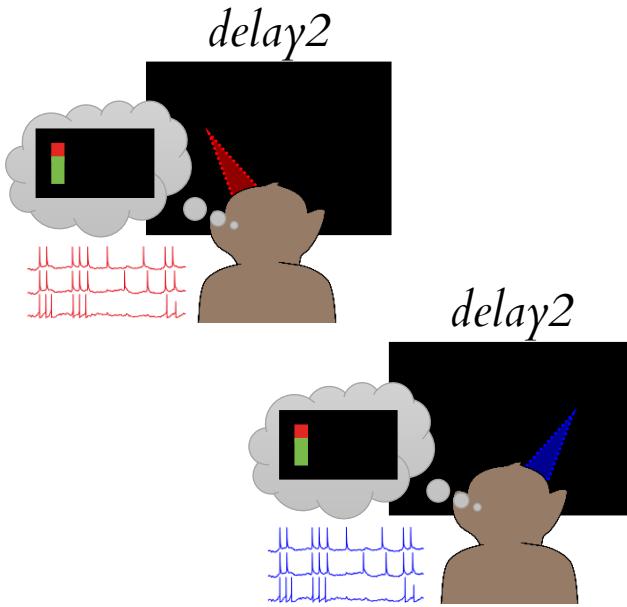
# GLM for OFC spiking activity



## Hypothesis:

Focusing on the Left offer EV, E(L)

if the monkey looks at **Left/Right** side,  
is the E(L) coding in OFC affected?

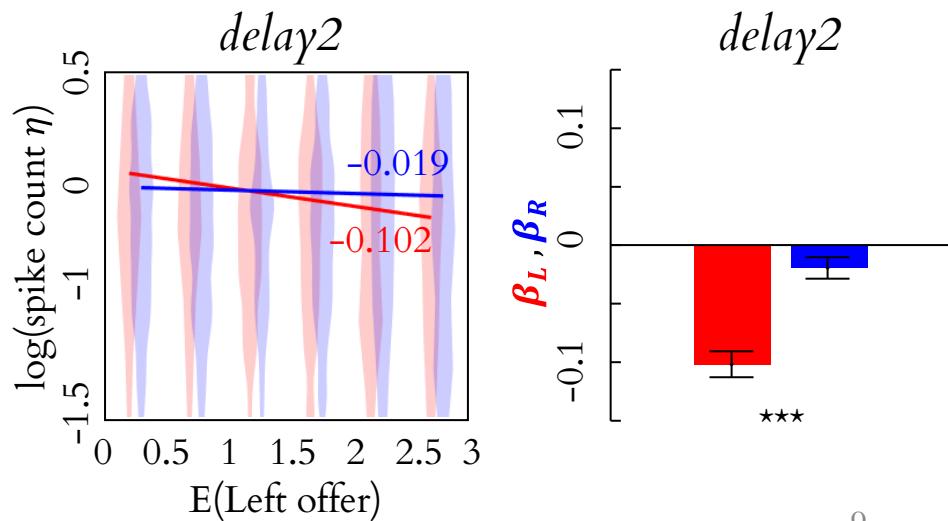


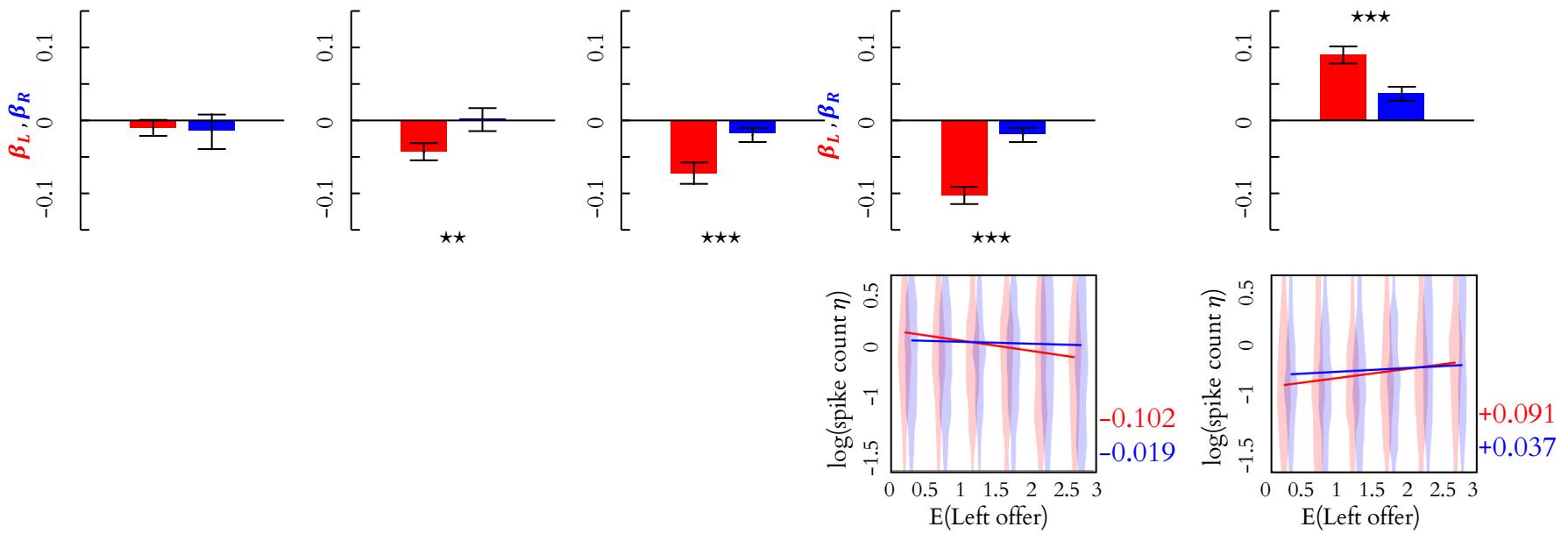
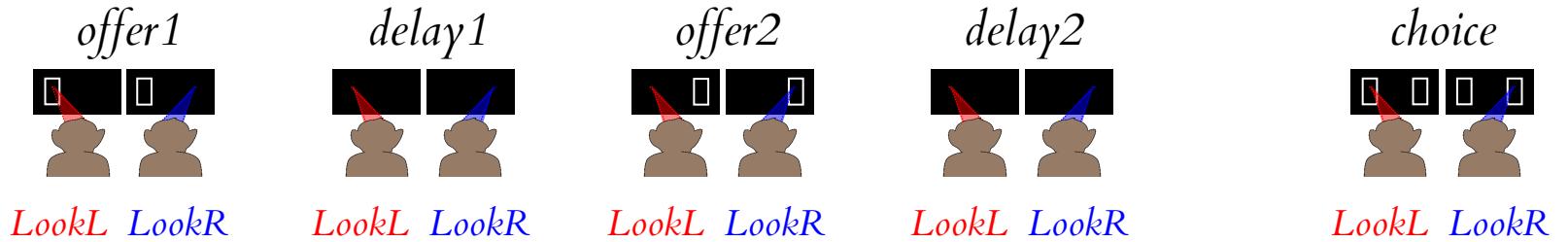
## Test:

Consider trials where monkey mostly

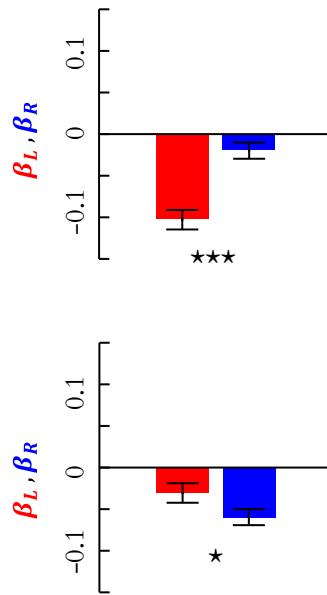
- **LookL**:  $tR/(tR+tL) < 0.5$
- **LookR**:  $tR/(tR+tL) > 0.5$
- **GLM for E(L): Look Left**  
 $\eta \approx \text{Poiss}(f^{-1}(\beta_{0,L} + \boldsymbol{\beta}_L \cdot E(L)))$
- **GLM for E(L): Look Right**  
 $\eta \approx \text{Poiss}(f^{-1}(\beta_{0,R} + \boldsymbol{\beta}_R \cdot E(L)))$

**$\boldsymbol{\beta}_L$  vs  $\boldsymbol{\beta}_R$ ??**

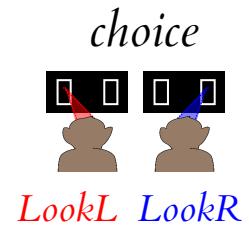
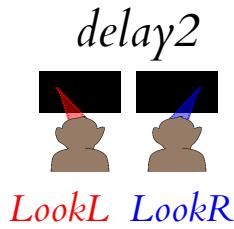
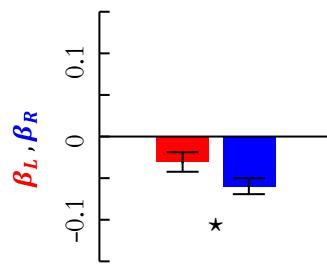




*GLM for E(L):*  
*LookL vs LookR*

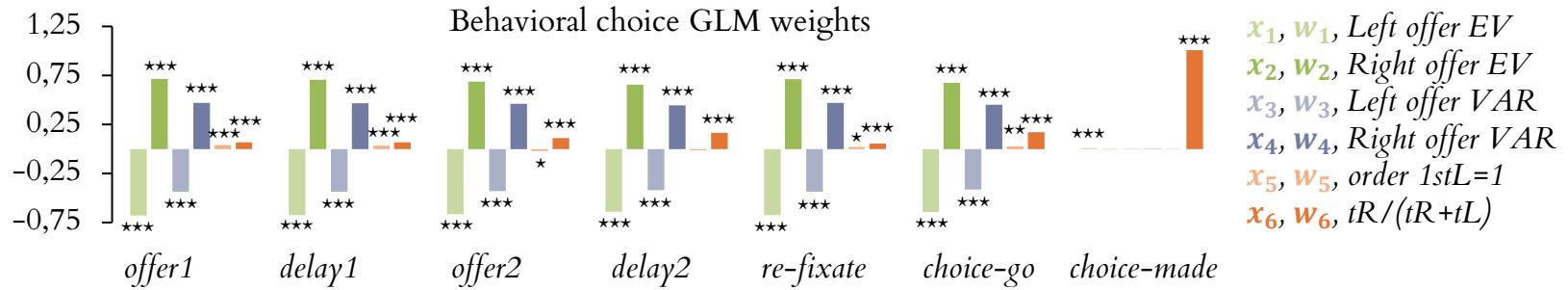


*GLM for E(R):*  
*LookL vs LookR*

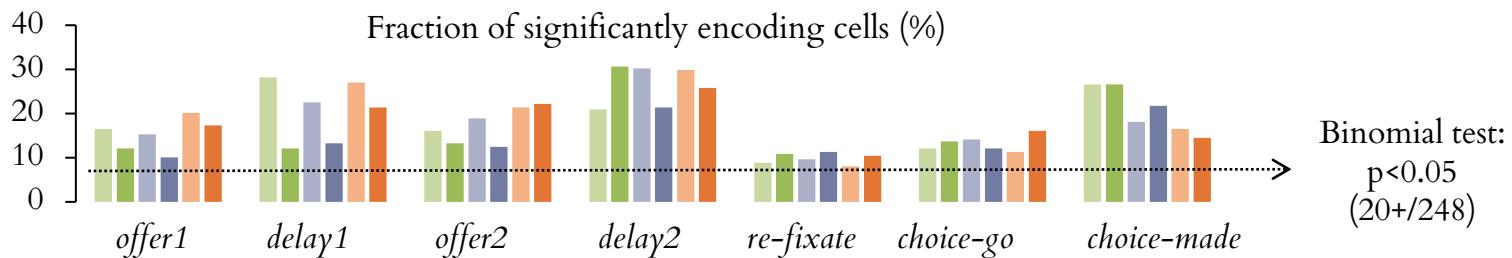


# Conclusions

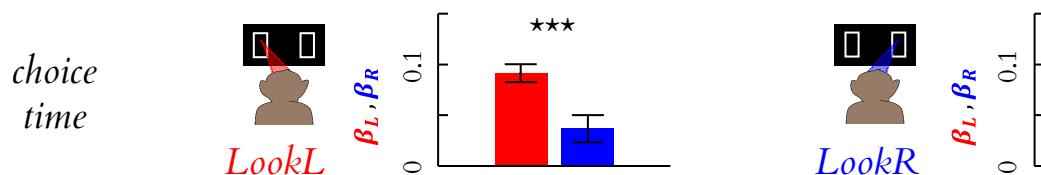
- The gaze position has a significant role in the reward gambling task execution: the fraction of time spent at either screen side is predictive of the chosen side;



- Task-relevant variables are encoded by a significant fraction of OFC cells, including the fraction of time spent inspecting either screen side;



- The gaze position is relevant in the process of encoding offer values: looking at either side possibly yields stronger coding of the ipsi-later offer EV.





## TCN Lab

Rubén Moreno Bote  
Anna Rifé Mata  
Alice Vidal  
Jorge Ramirez Ruiz  
Chiara Mastrogiovanni  
Carolina Schneider Bender  
Devin Ozbağcı  
Dmytro Grytskyy  
Farhad Razi  
Sofia Lawrie  
Alireza Valyan  
Francesco Damiani  
Fatma Aboalasaad

## Collaborators

Benjamin Hayden,  
Tyler Cash-Padgett,  
Maya Zhe-Wang,

Hayden Lab, [haydenlab.com](http://haydenlab.com)  
University of Minnesota,  
Dept. Neuroengineering,  
Minneapolis, USA.

## Fundings



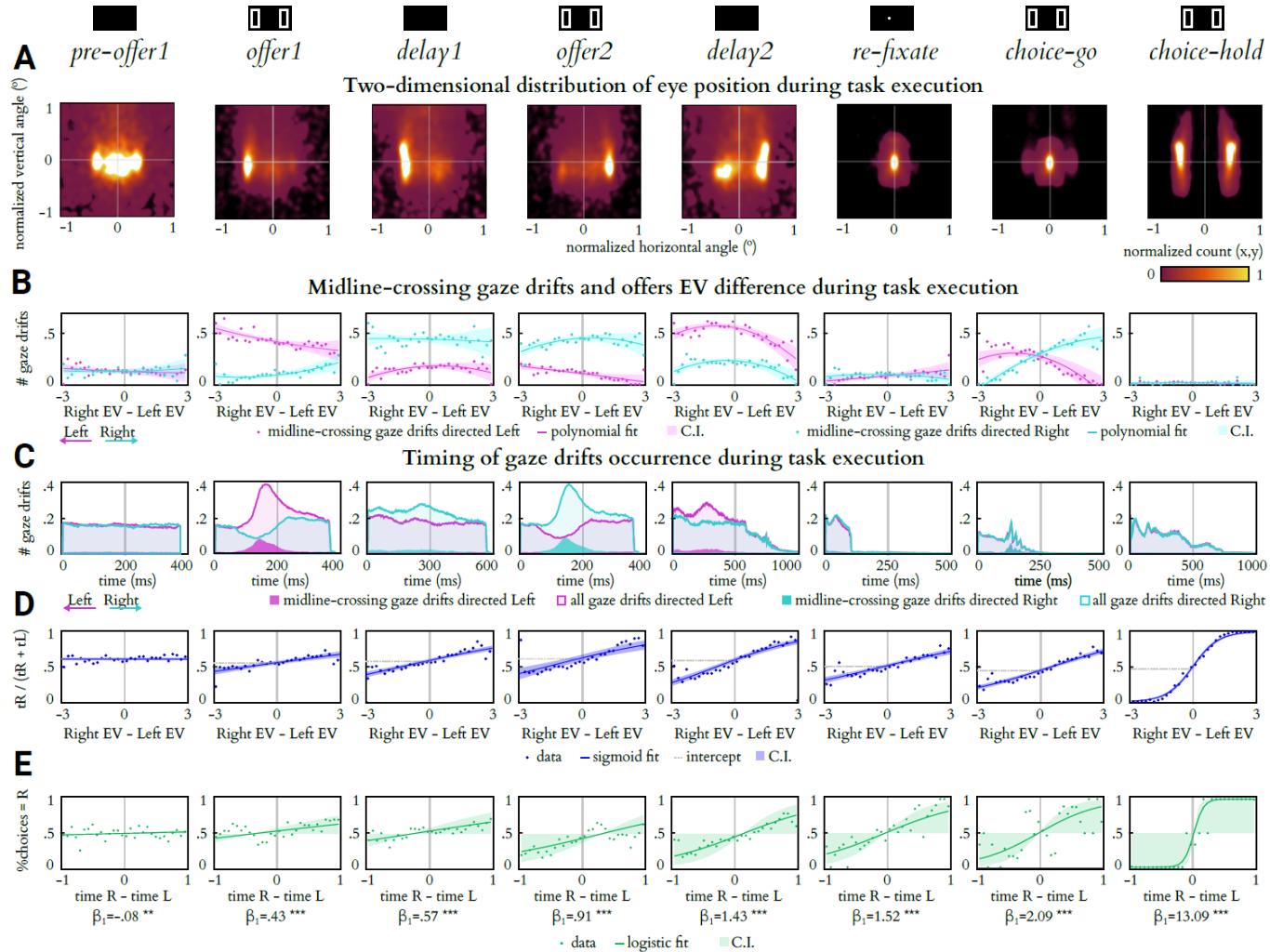
Universitat  
Pompeu Fabra  
Barcelona

**TCN** [upf.edu/web/tcn](http://upf.edu/web/tcn)  
Research Group on Theoretical  
and Cognitive Neuroscience

Thank you for your attention.



# Eye Data

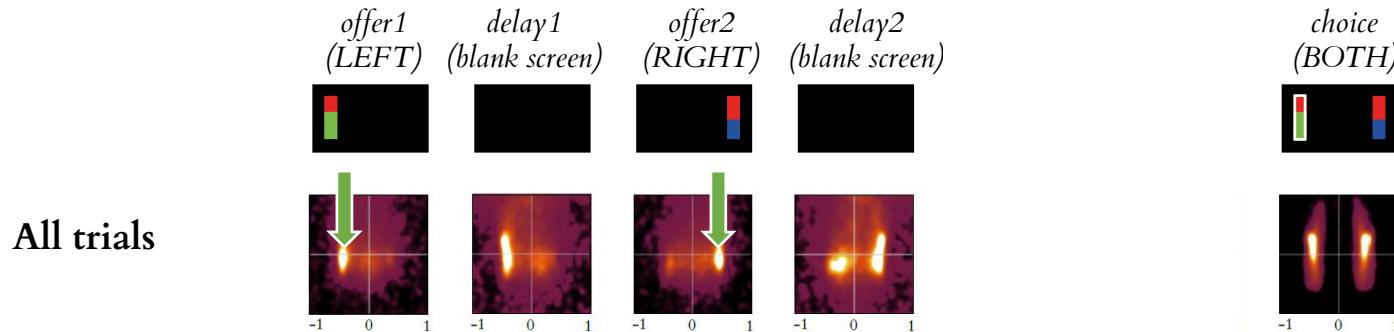


What is the eye position during task execution?

What is the fraction of time spent on either side given EV difference?

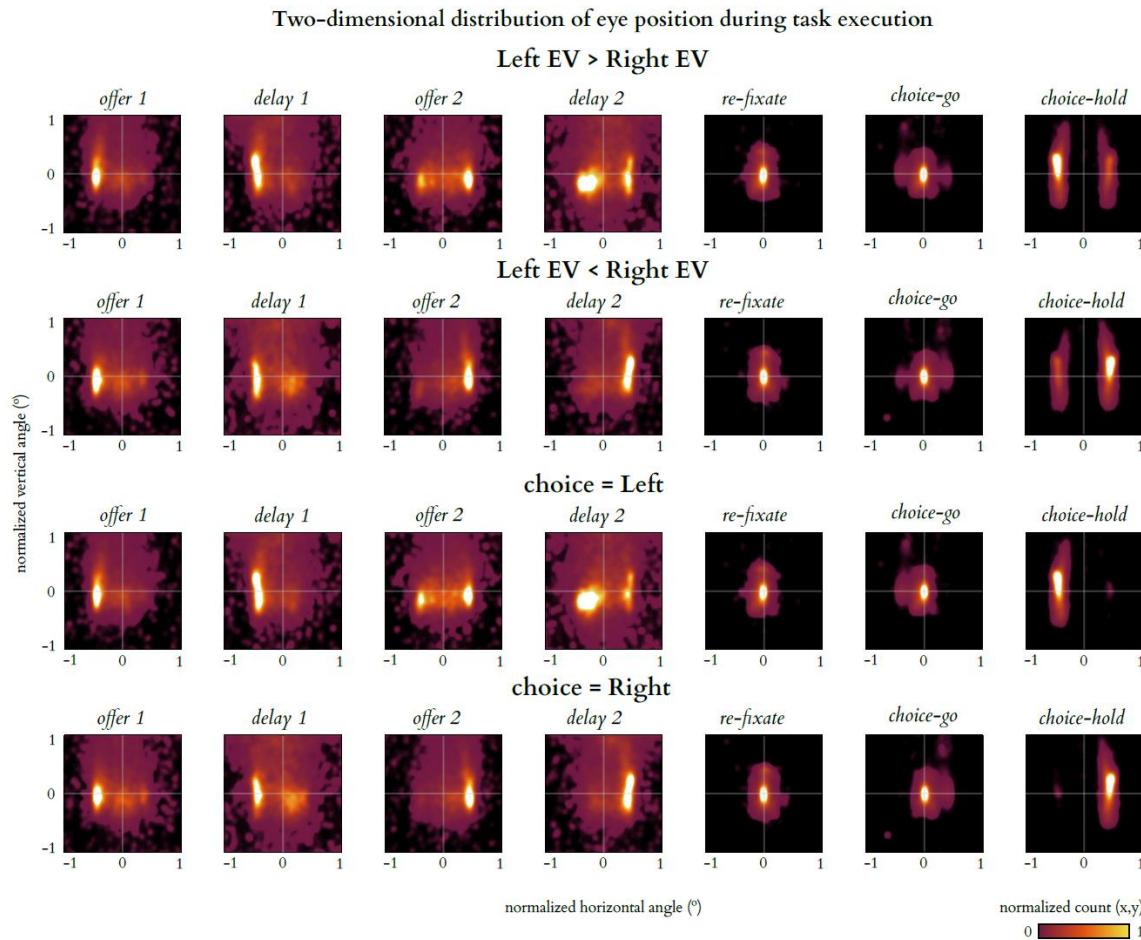
Is the difference in time related to the final choice?

# Eye movements during task execution



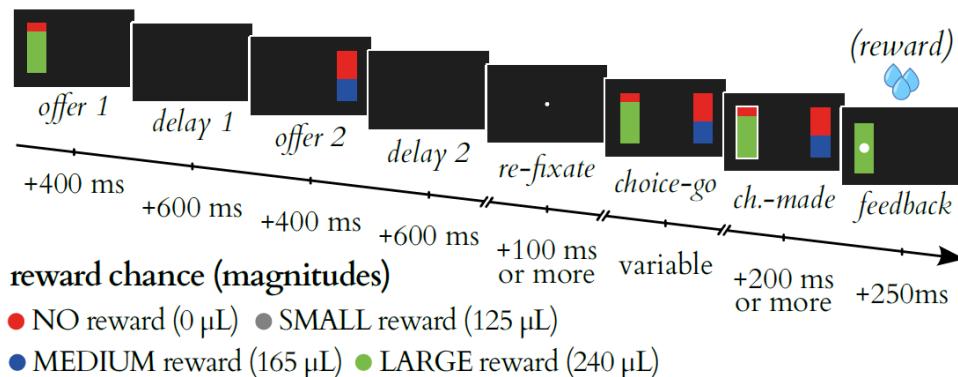
- Subject is inspecting the CURRENT offer (on screen)
- Subject is not interested in CURRENT offer (on screen) since it is not the best
- Subject drifts the gaze to NEXT offer location (blank screen) for a better value
- Subject drifts the gaze back to PREVIOUS location (blank screen) for a better value
- Subject correctly holds the gaze to choose the BEST offer

# Eye Data

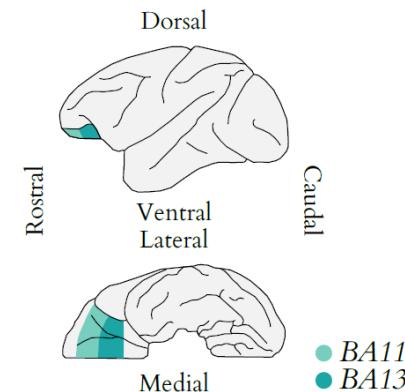


# Experimental paradigm

## Reward gambling task



## Orbito-Frontal Cortex (OFC)



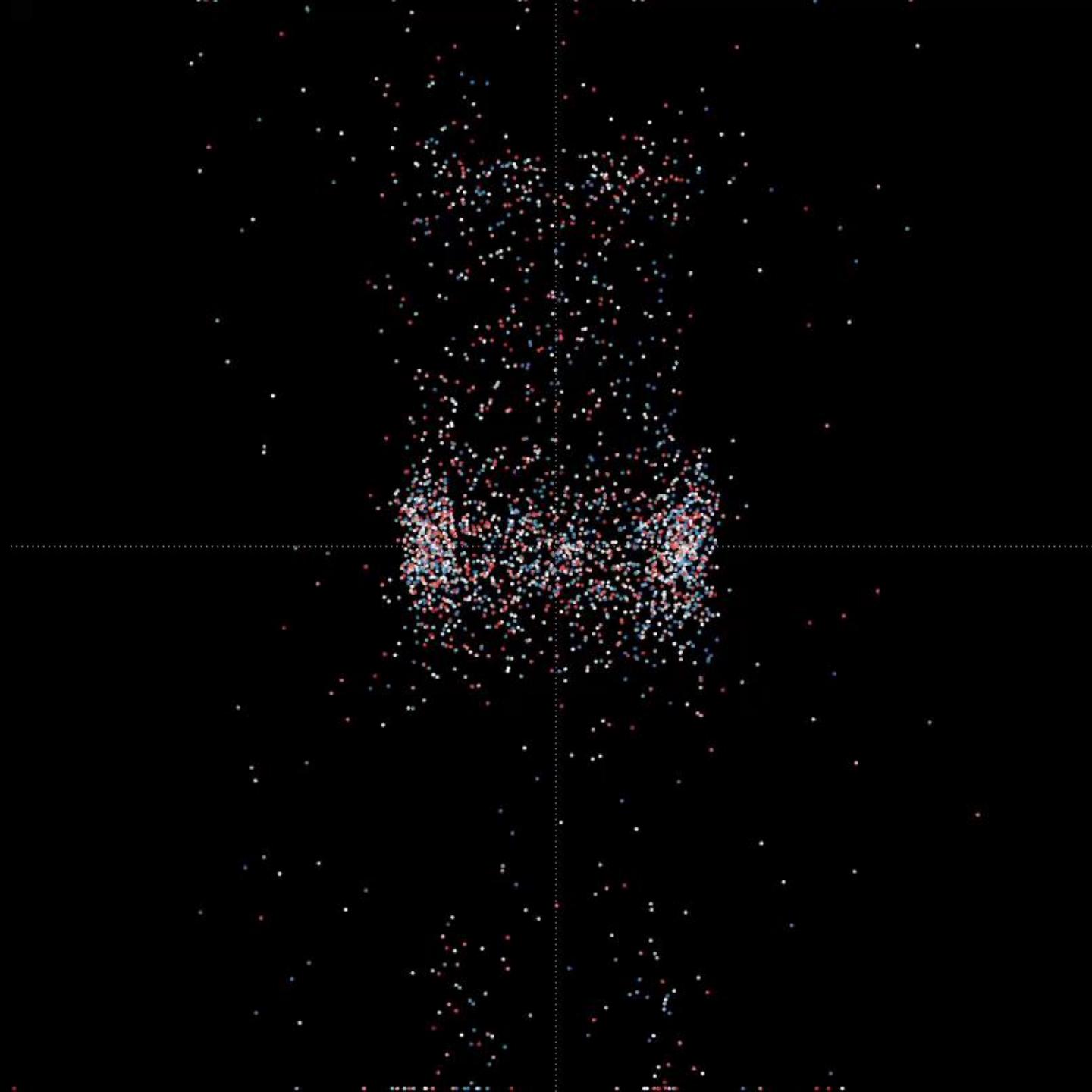
## Data acquisition



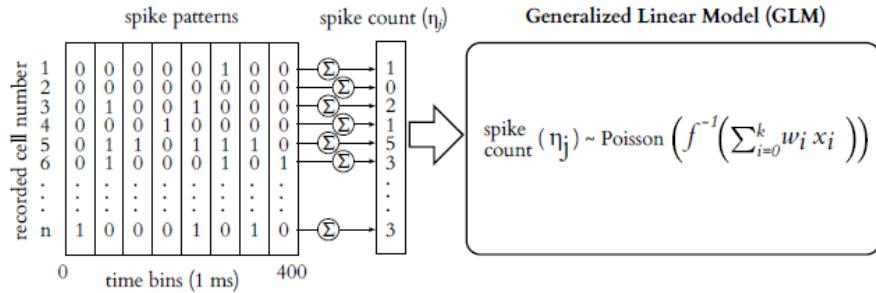
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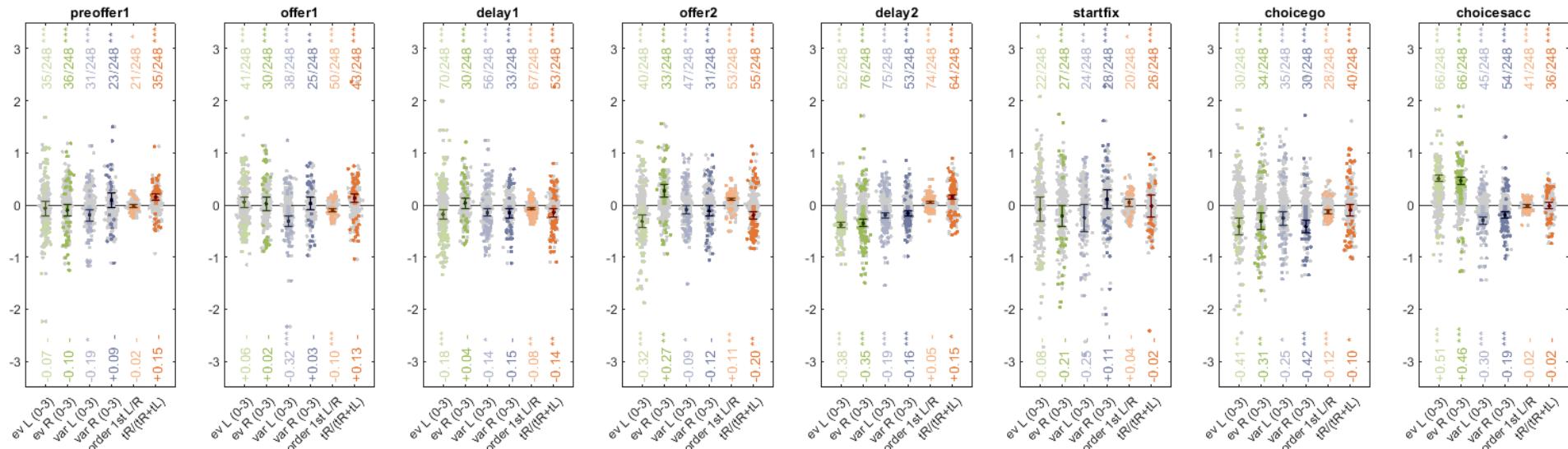
## Eye Data



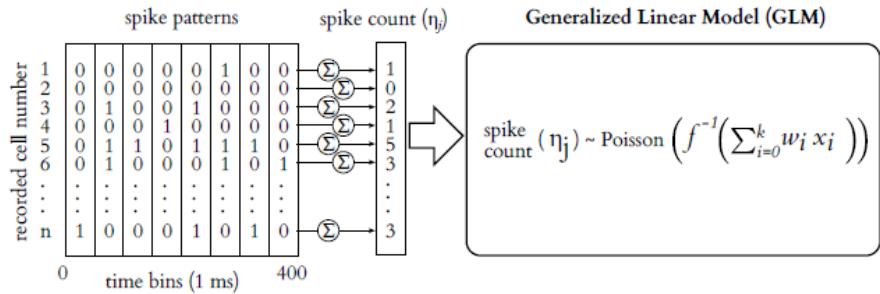
# GLM for neural spiking activity



- $x_1, w_1$ , Left offer EV
  - $x_2, w_2$ , Right offer EV
  - $x_3, w_3$ , Left offer VAR
  - $x_4, w_4$ , Right offer VAR
  - $x_5, w_5$ , order 1stL=1
  - $x_6, w_6$ ,  $tR/(tR+tL)$
- n.s. • P<0.05

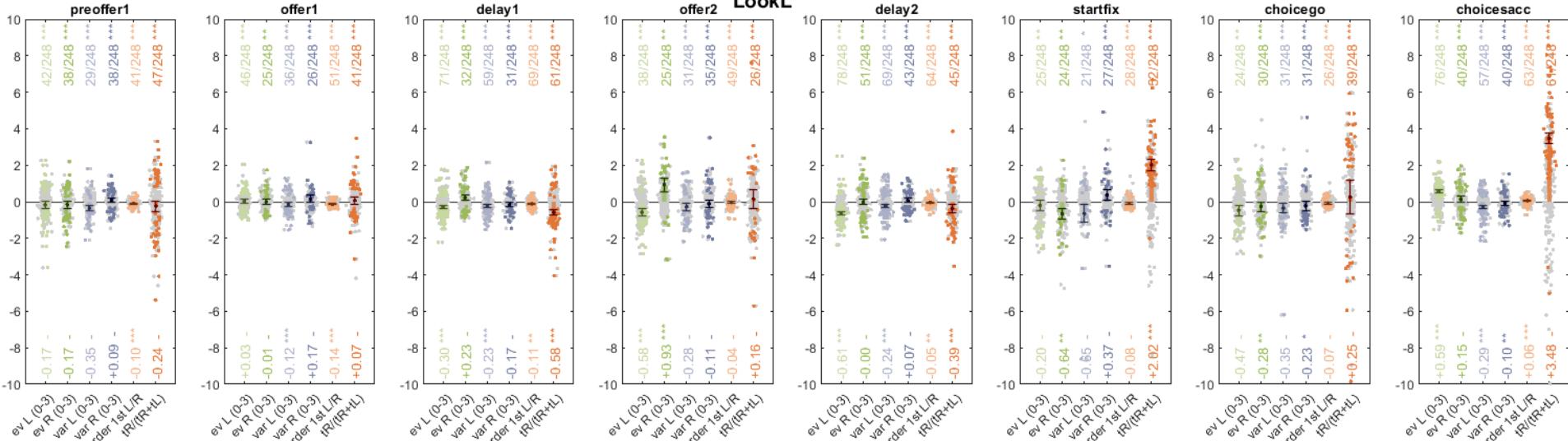


# GLM for neural spiking activity

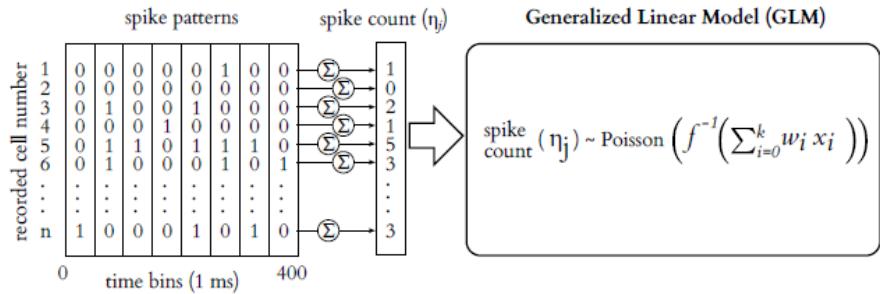


- $x_1, w_1$ , Left offer EV
- $x_2, w_2$ , Right offer EV
- $x_3, w_3$ , Left offer VAR
- $x_4, w_4$ , Right offer VAR
- $x_5, w_5$ , order 1stL=1
- $x_6, w_6$ , tR/(tR+tL)

● n.s. ● ● ● ● ○ P<0.05

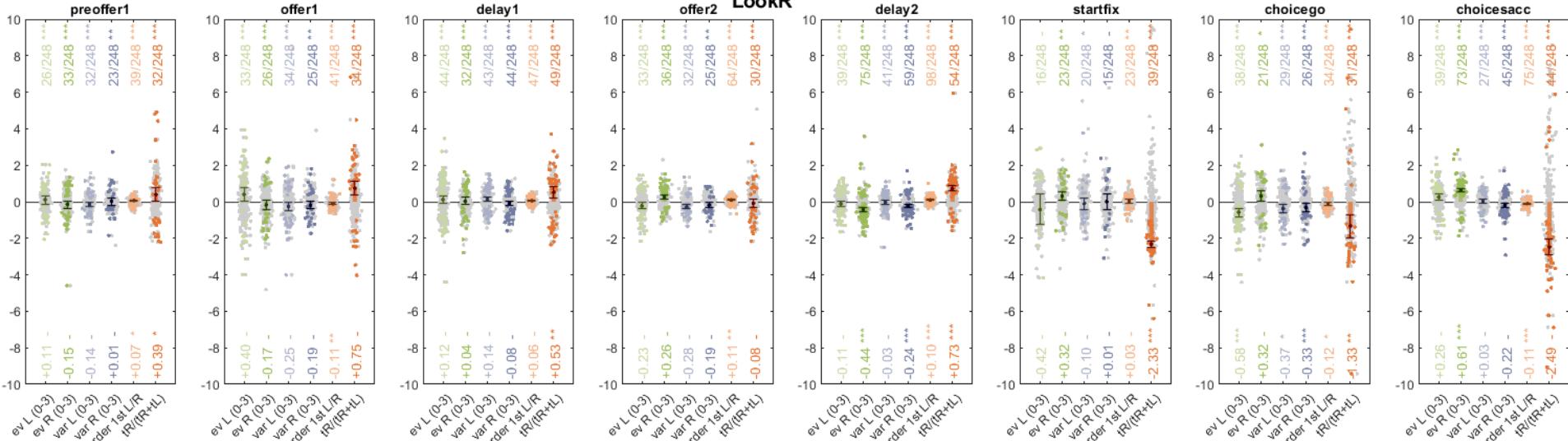


## GLM for neural spiking activity

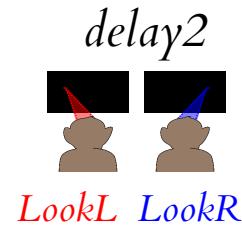
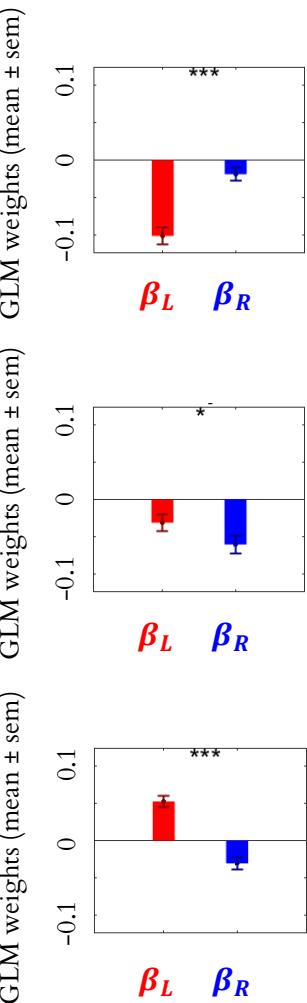


- $x_1, w_1$ , Left offer EV
- $x_2, w_2$ , Right offer EV
- $x_3, w_3$ , Left offer VAR
- $x_4, w_4$ , Right offer VAR
- $x_5, w_5$ , order 1stL=1
- $x_6, w_6$ , tR/(tR+tL)

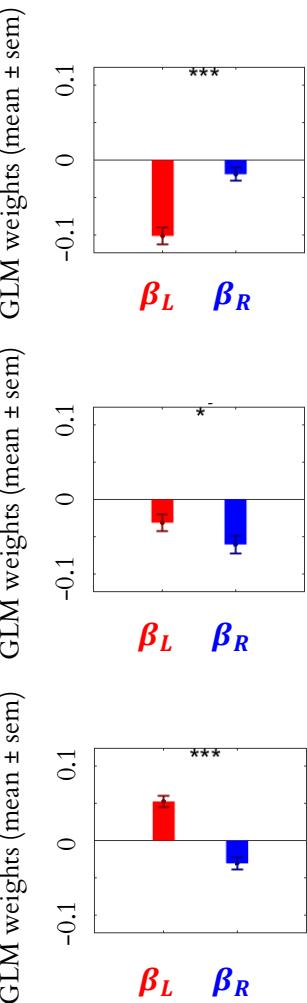
● n.s. ● ● ● ● ○ ○ P<0.05



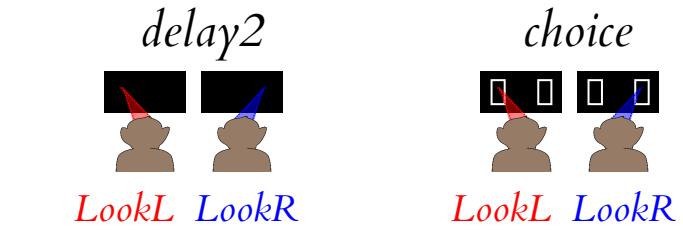
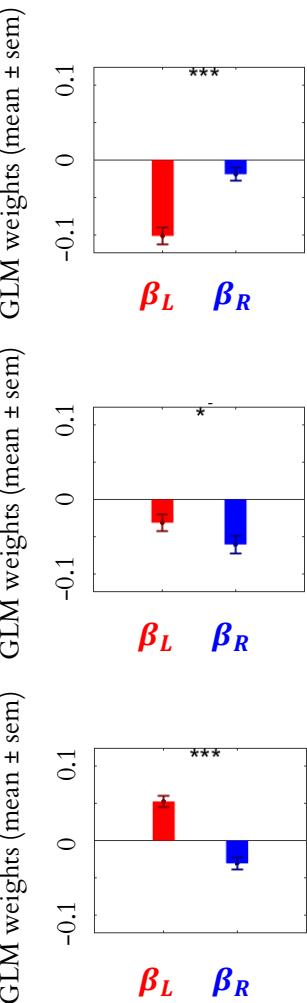
*GLM for E(L):*  
*LookL vs LookR*

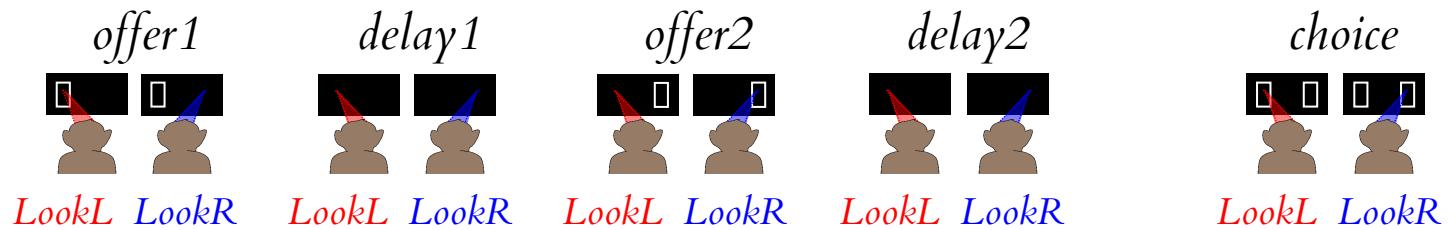


*GLM for E(R):*  
*LookL vs LookR*

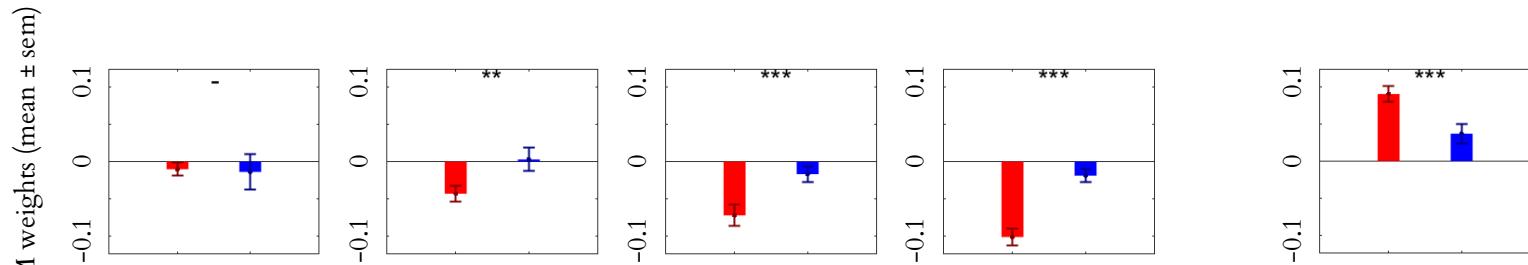


*GLM for*  
*E(R)–E(L):*  
*LookL vs LookR*

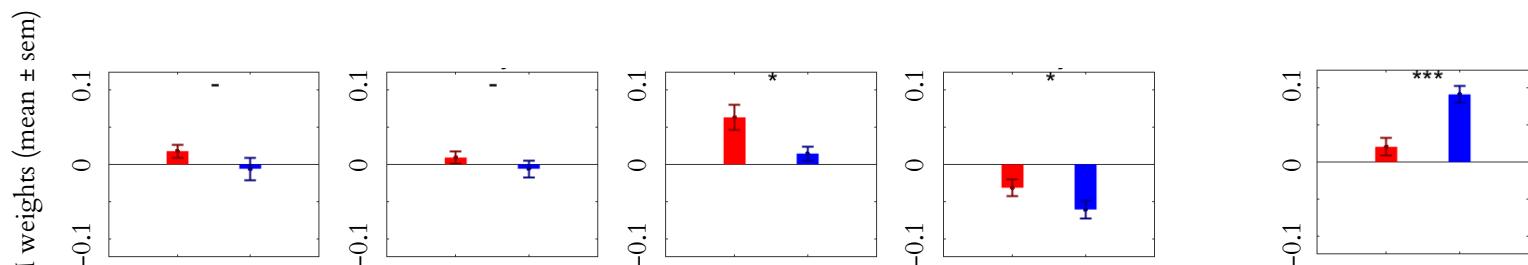




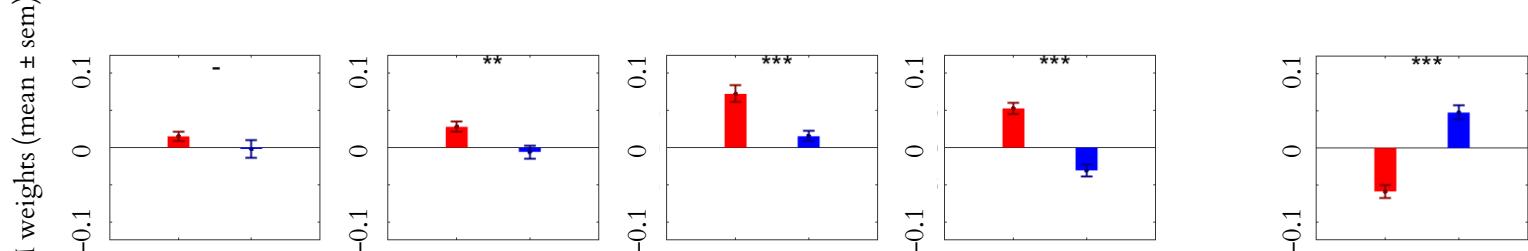
*GLM for E(L):  
LookL vs LookR*

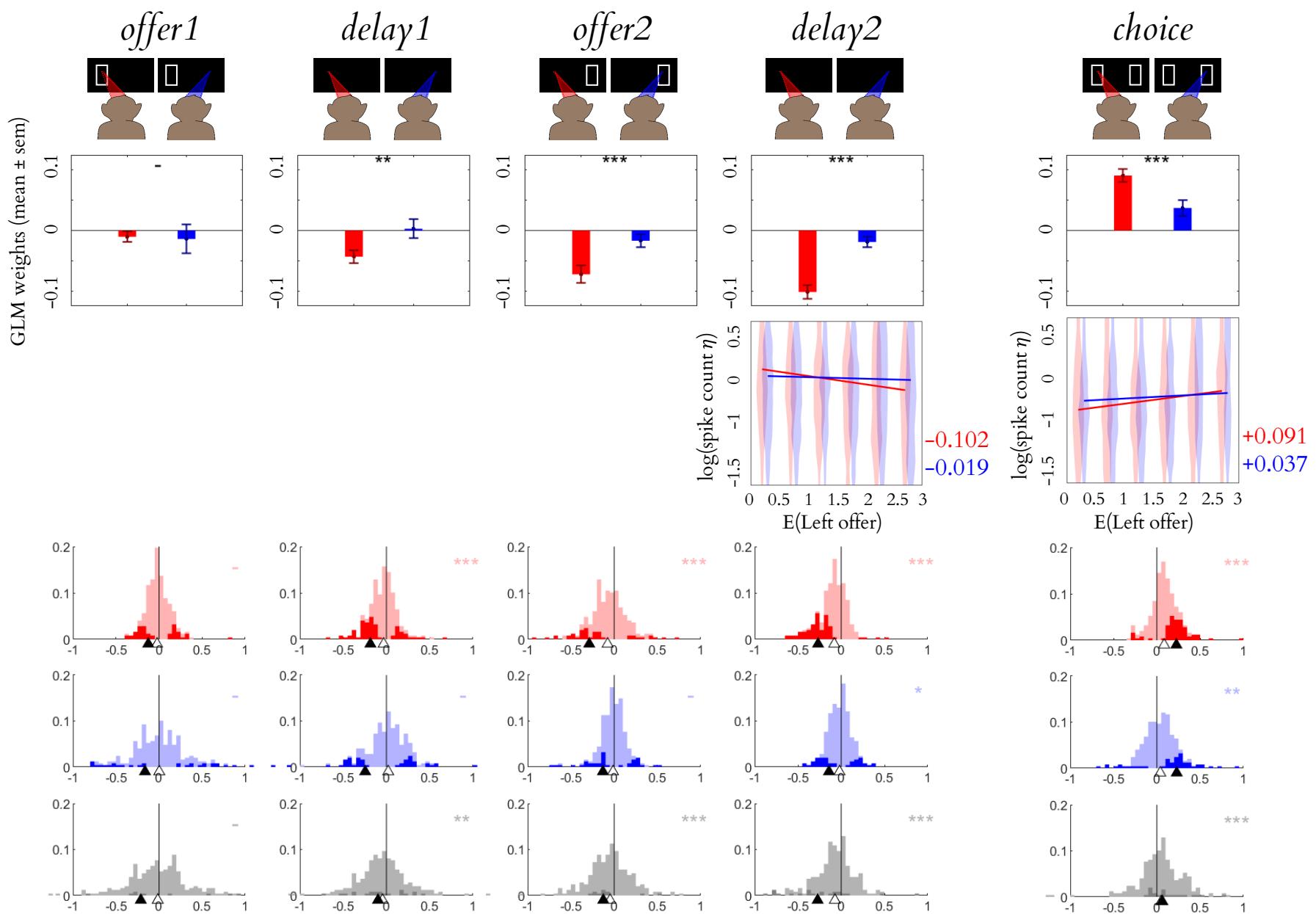


*GLM for E(R):  
LookL vs LookR*



*GLM for  
E(R)-E(L):  
LookL vs LookR*





Significant  $\beta_L$

Signif. & n.s.  $\beta_L$

Significant  $\beta_R$

Signif. & n.s.  $\beta_R$

$(\beta_L - \beta_R)$  for signif.  $\beta_L$  & signif.  $\beta_R$

$(\beta_L - \beta_R)$  for signif. & n.s.  $\beta_L, \beta_R$

OfferLev lookL  
OfferLev lookR

Preoffer1

Offer1

Delay1

Offer2

Delay2

Re-fixate

Choice-Go

Choice-saccade

73/248 (%)\*\*\*

38/248 \*\*\*

43/248 (%)\*\*\*

71/248 (%)\*\*\*

16/248

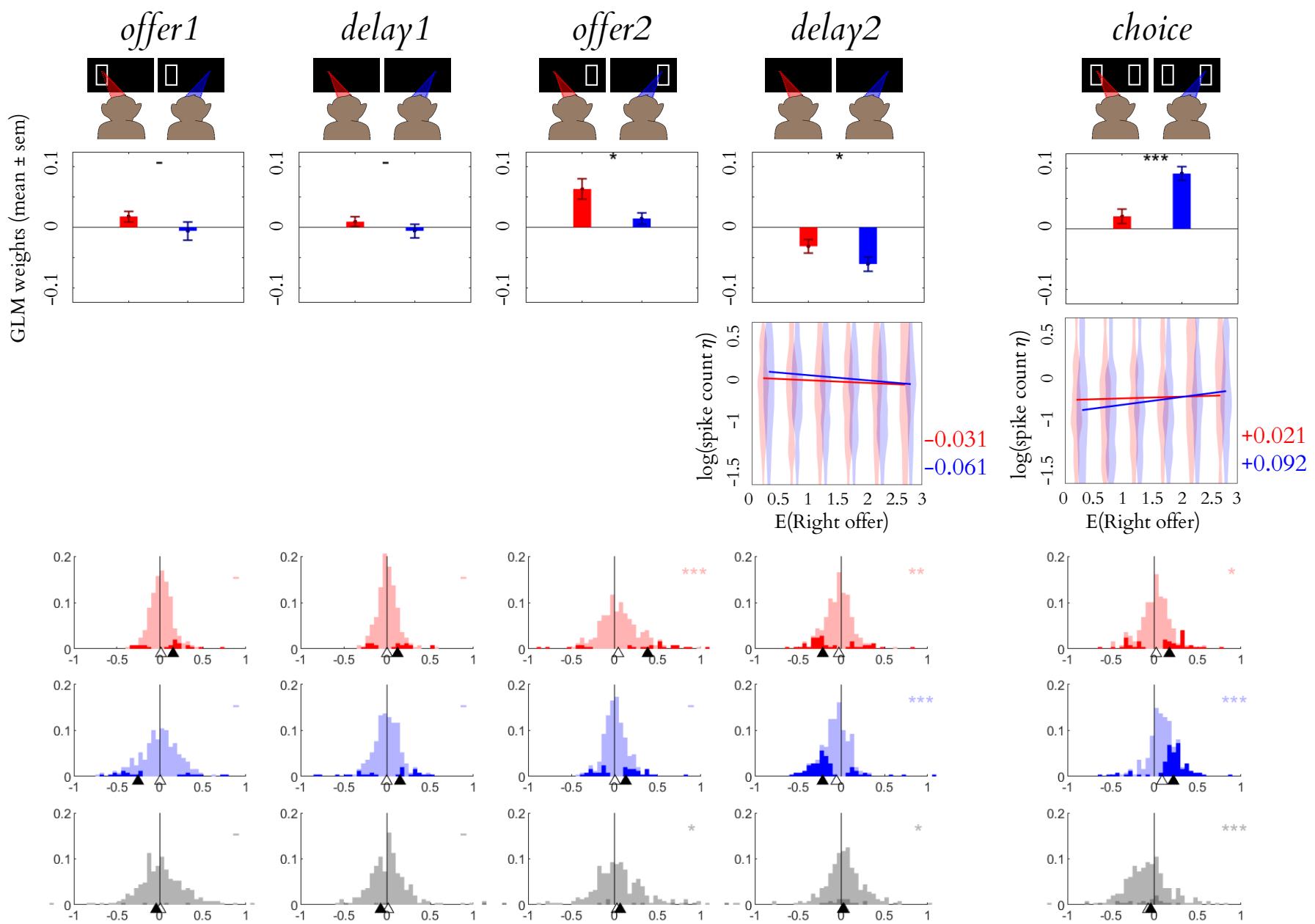
25/248\*\*

26/248\*\*\*

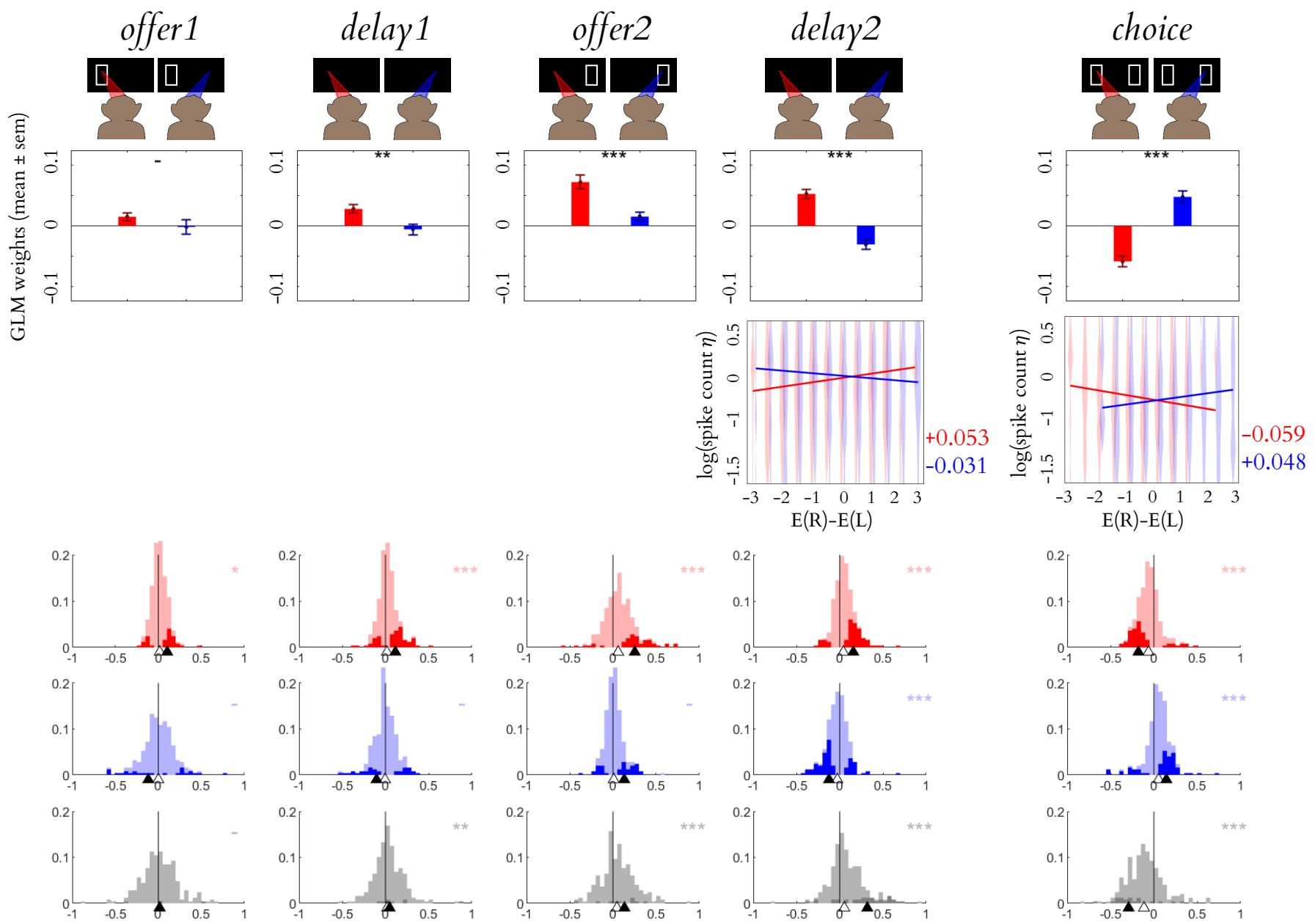
37/248\*\*\*

69/248 (%)\*\*\*

49/248 (%)\*\*\*



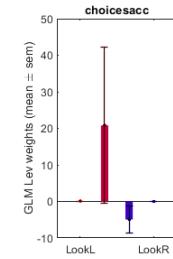
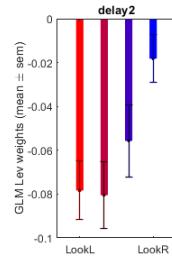
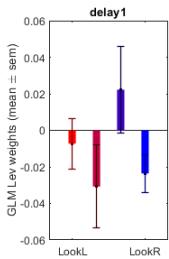
	Preoffer1	Offer1	Delay1	Offer2	Delay2	Re-fixate	Choice-Go	Choice-saccade
OfferLev lookL	43/248***	25/248**	22/248 (%)*	28/248 ***	47/248 (%)***	27/248***	30/248***	48/248 (%)***
OfferLev lookR	38/248***	24/248**	29/248 (%)***	43/248 ***	78/248 (%)***	23/248**	27/248***	89/248 (%)***



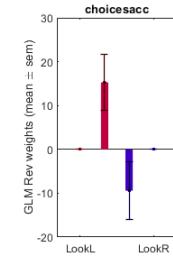
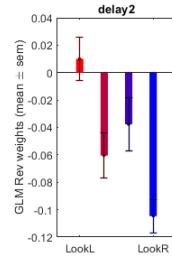
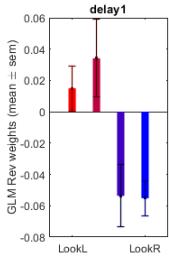
	Preoffer1	Offer1	Delay1	Offer2	Delay2	Re-fixate	Choice-Go	Choice-saccade
OfferLev <b>lookL</b>	49/248***	35/248***	58/248 (%)***	45/248 ***	67/248 (%)***	28/248**	31/248***	61/248 (%)***
OfferLev <b>lookR</b>	39/248***	26/248***	34/248 (%)***	40/248 ***	78/248 (%)***	21/248*	22/248*	66/248 (%)***

What if we used more bins for Look L vs Look R? i.e.  $tR/(tR+tL)$  binned as  $[0, 0.25, 0.5, 1]$

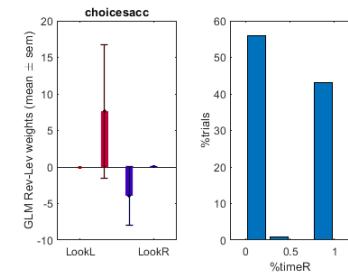
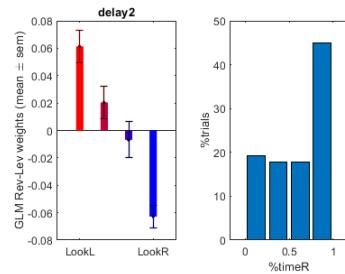
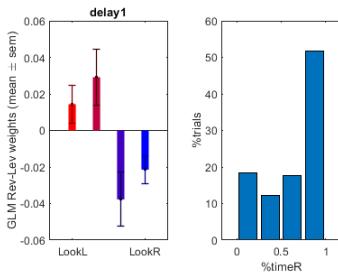
GLM for spike count  $\eta$ :  
 $\eta \approx \exp(\beta_0 + \beta_1 \cdot (L_{EV}))$



GLM for spike count  $\eta$ :  
 $\eta \approx \exp(\beta_0 + \beta_1 \cdot (R_{EV}))$

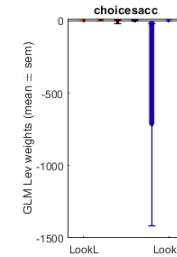
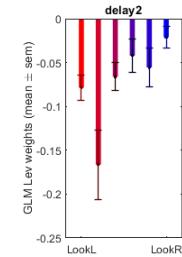
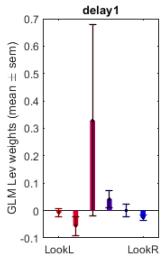


GLM for spike count  $\eta$ :  
 $\eta \approx \exp(\beta_0 + \beta_1 \cdot (R_{EV} - L_{EV}))$

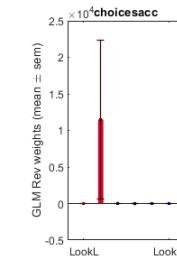
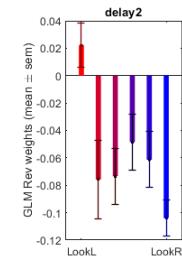
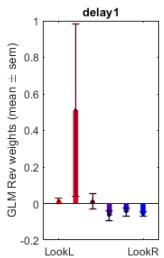


What if we used more bins for Look L vs Look R? i.e.  $tR/(tR+tL)$  binned as  $[0, 1/6, 2/6, 3/6, 4/6, 5/6, 1]$

GLM for spike count  $\eta$ :  
 $\eta \approx \exp(\beta_0 + \beta_1 \cdot (L_{EV}))$



GLM for spike count  $\eta$ :  
 $\eta \approx \exp(\beta_0 + \beta_1 \cdot (R_{EV}))$



GLM for spike count  $\eta$ :  
 $\eta \approx \exp(\beta_0 + \beta_1 \cdot (R_{EV} - L_{EV}))$

