



Human and robotic eye-head

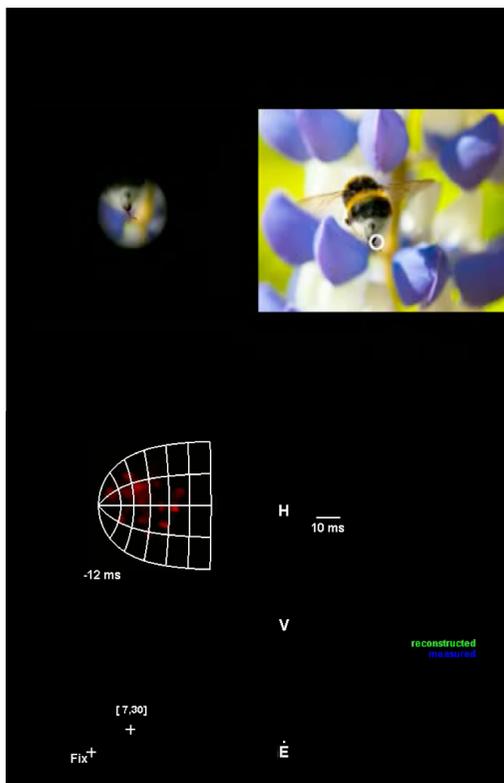
3D gaze control

in a multisensory world:

Lisboa-Nijmegen ERC project “Orient”

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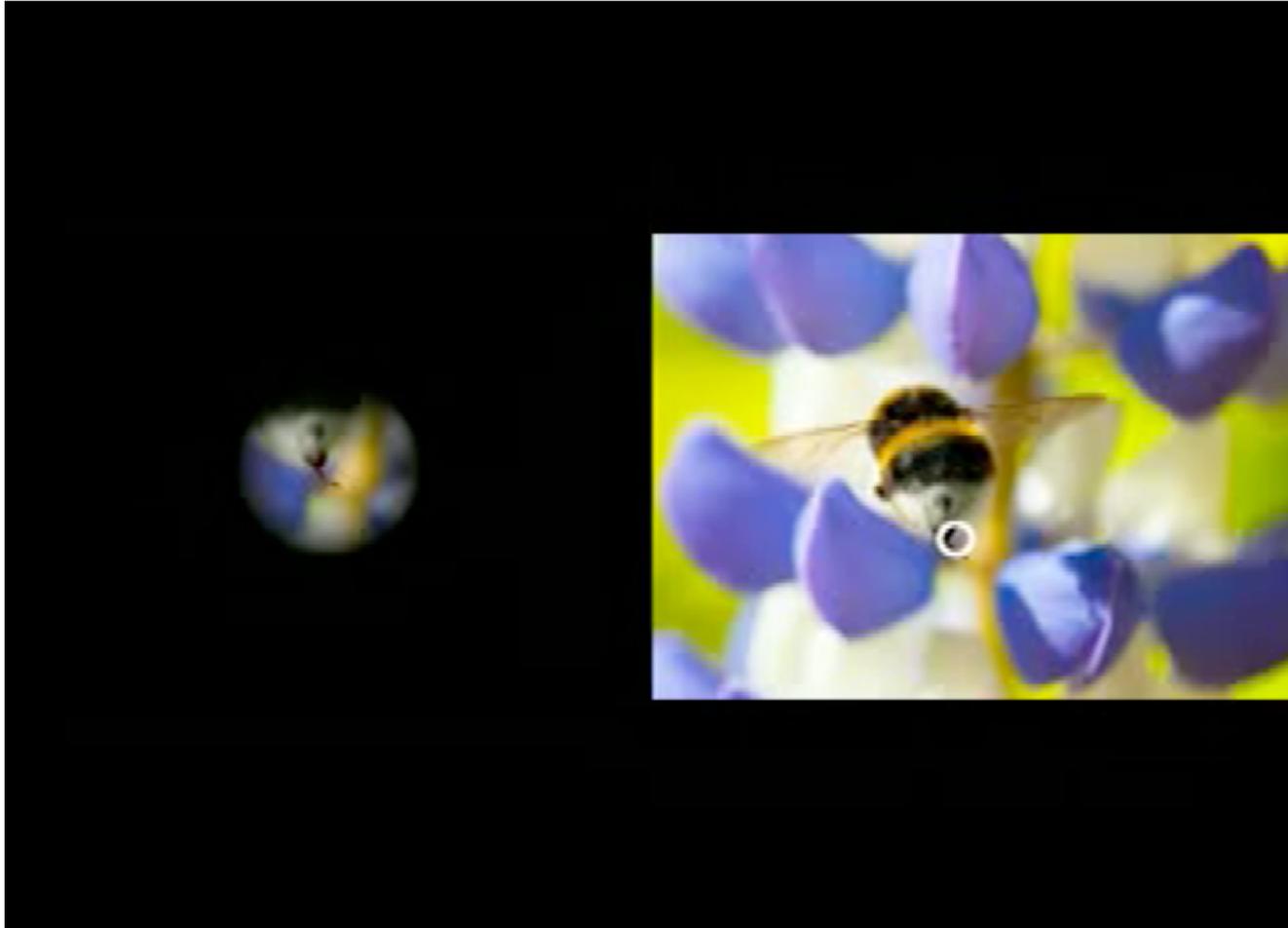


European Research Council
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Saccades: Why?

WHAT YOU SEE

WHAT YOU GET



High-resolution, discontinuous
local (foveal) input

A high-resolution global,
stable percept

We make ~3 saccades/s;
For each saccade, the
brain should decide:

- **What?**
- **Where?**
- **When?**
- **How?**

To construct a stable visual
representation, the
saccadic system should
account for its own
behavior (efference
copies/internal models/
memory/coordinate
transformations).

Because of the low-resolution
(uncertain) retinal periphery,
the gaze-control system is
thought to optimize
speed-accuracy trade-off.

The saccadic gaze-control system is a “clever” system, optimally organized to carry out a well-defined task:

**“DIRECT THE FOVEA AS FAST AND AS ACCURATELY
AS POSSIBLE TO THE TARGET”**

However, the system has to overcome several nontrivial problems:

- 1) Deal with a sluggish (overdamped) oculomotor plant
- 2) Deal with costs of overshoots and sensorimotor noise
- 3) Deal with spatial-temporal uncertainties in peripheral vision
- 4) Update target coordinates after every intervening movement
- 5) Coordinate eyes and head in different reference frames
- 6) Account for the non-commutative properties of 3D rotations

1. Saccades: How?

1

How to overcome a sluggish oculomotor plant?

1. Saccades: How?

First, some Linear System's theory:

We consider a saccadic eye movement as the **STEP POSITION RESPONSE** of the visuomotor system.

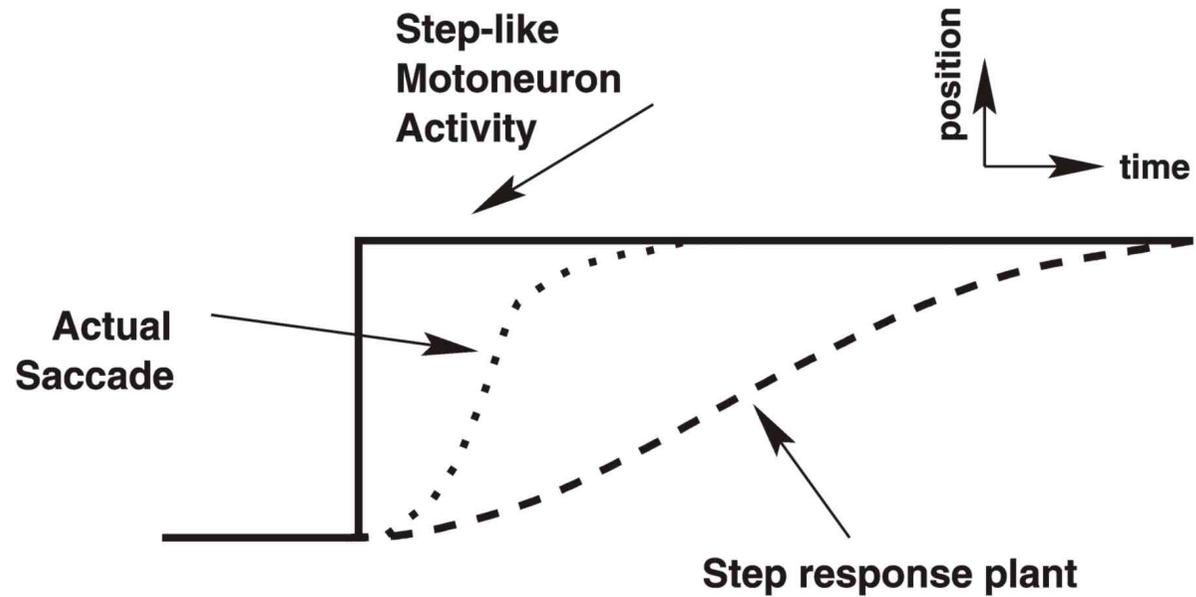
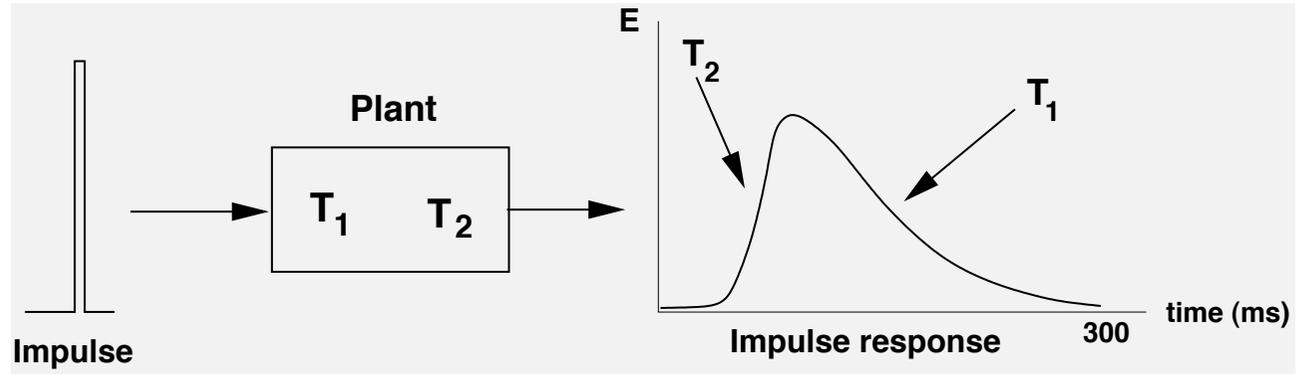
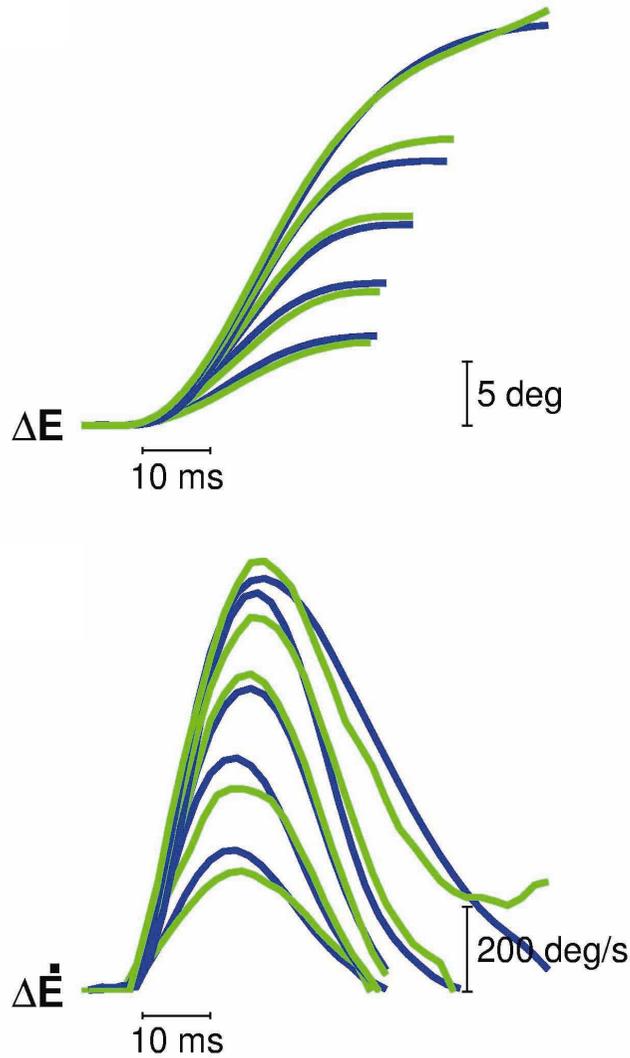


Let's suppose that an ideal saccade = a **STEP**

An optimal saccadic system should then perform the **IDENTITY OPERATION**
(output = input).

1. Saccades: How?

However, the eye/muscles/tissues behave as an **overdamped plant**

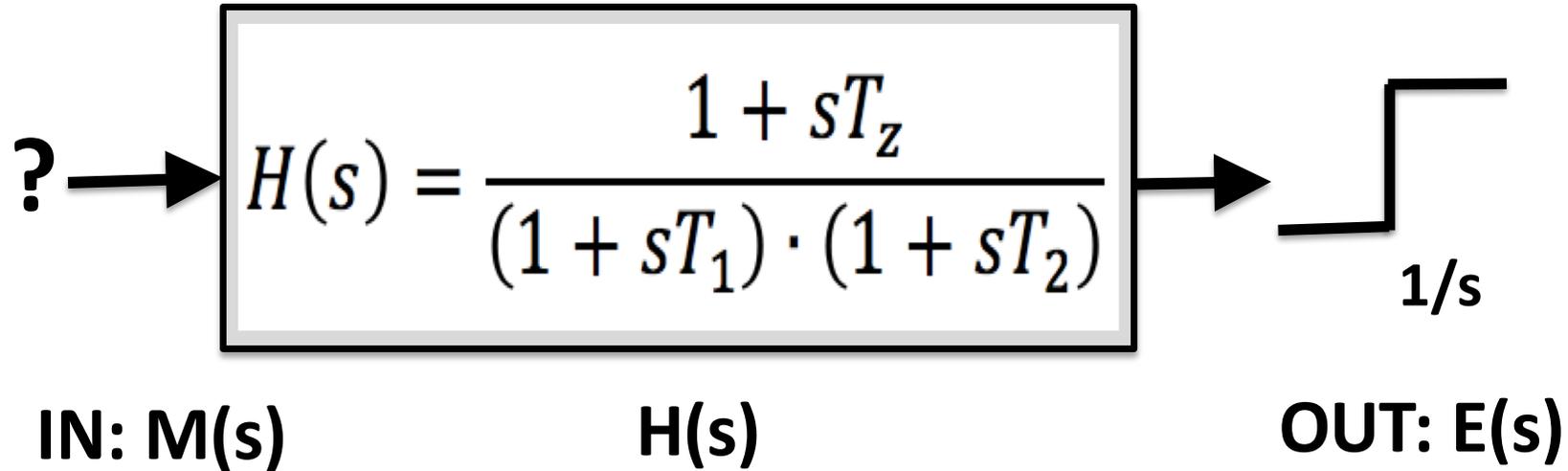


Conclusion, the motor-neuronal control signal CANNOT be a position-step command!

1. Saccades: How?

With a (linear) model of the plant its control signal can be readily predicted.

Dave Robinson modeled the plant transfer function by two Voigt elements in series:



Linear Systems Theory: $E(s) = H(s) \cdot M(s)$

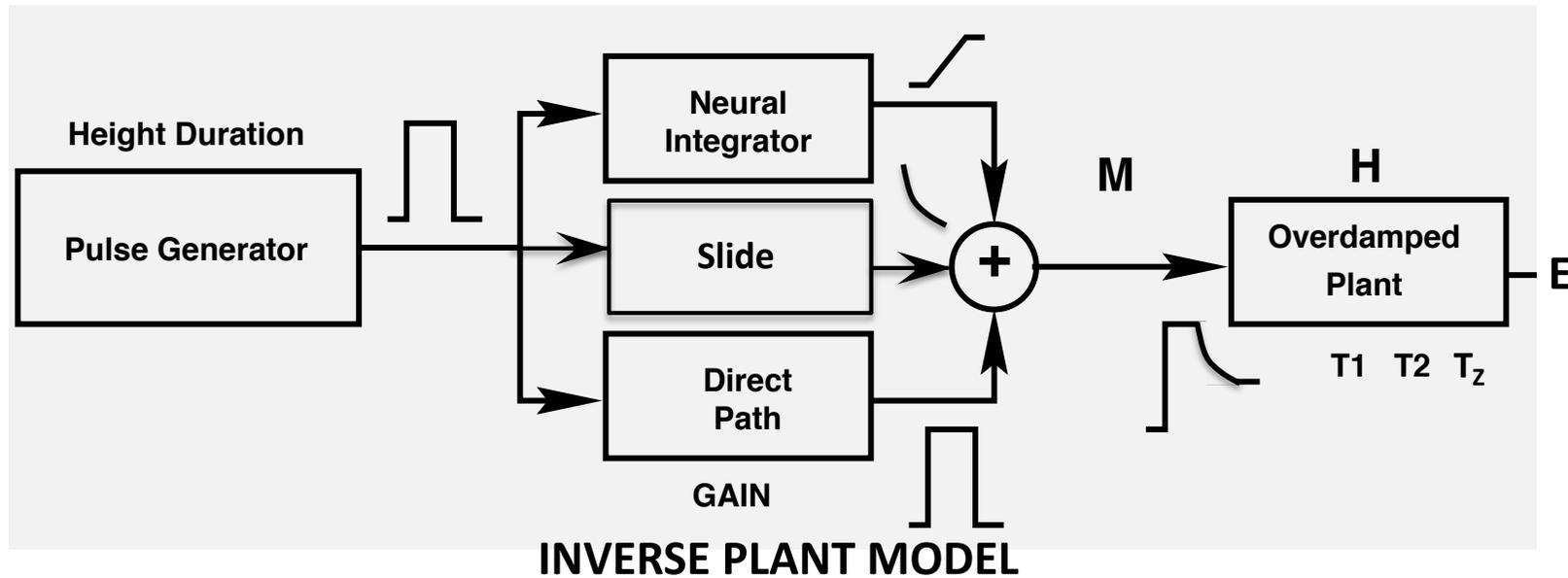
$$M(s) = \frac{E(s)}{H(s)} \Rightarrow M(s) = \frac{T_1 T_2}{T_z} + \frac{1}{s} + \frac{c}{s + 1/T_z} \quad [c = f(T_1, T_2, T_z)]$$

1. Saccades: How?

$$M(s) = \frac{T_1 T_2}{T_z} + \frac{1}{s} + \frac{c}{s + 1/T_z} \Rightarrow m(t) = \frac{T_1 T_2}{T_z} \delta(t) + U(t) + c \cdot \exp(-t/T_z)$$

This plant model thus predicts that the optimal motorneuron control contains THREE signals:

- a PULSE (height $T_1 T_2 / T_z$): $\delta(t)$
- a STEP: $U(t)$
- an exponential SLIDE (T_z): $\exp(-t/T_z)$



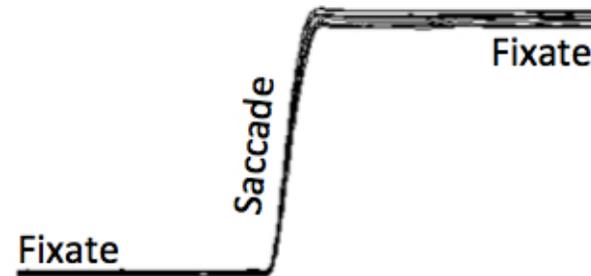
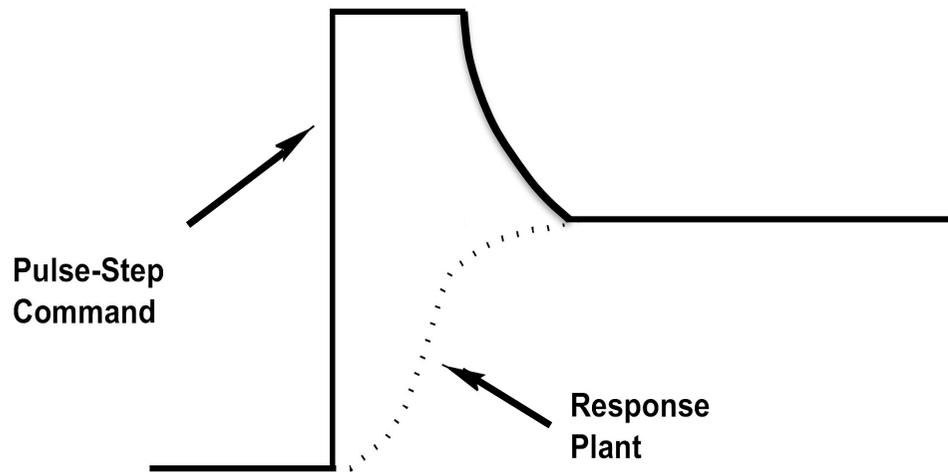
(PULSE-SLIDE-STEP GENERATOR, or PSSG)



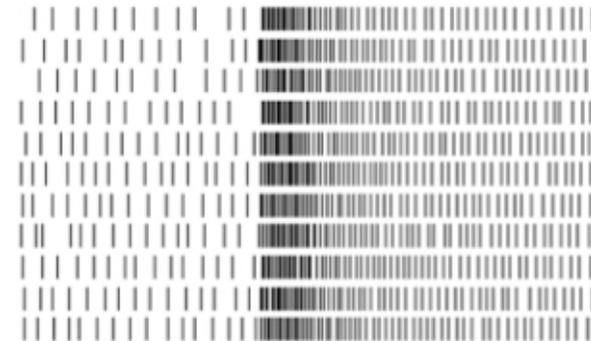
1. Saccades: How?

From the simple linear, overdamped, model for the eye plant (muscles + globe) the theoretical prediction is that the optimal neural control signal is a **PULSE-SLIDE-STEP** motor command!

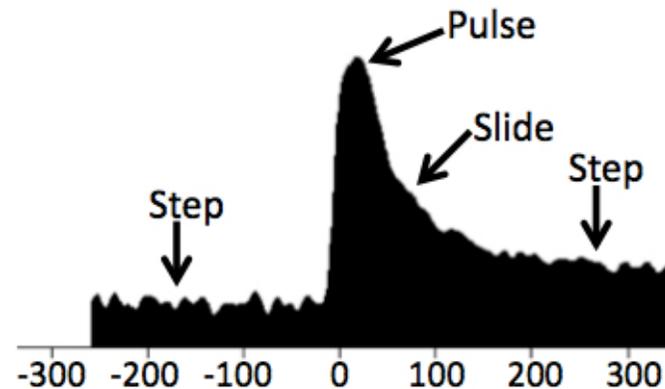
This prediction has been verified by neural recordings from oculomotor neurons.



Saccades



Abducens spike trains



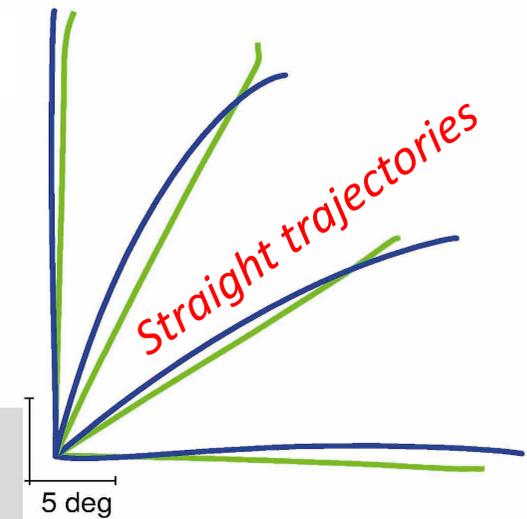
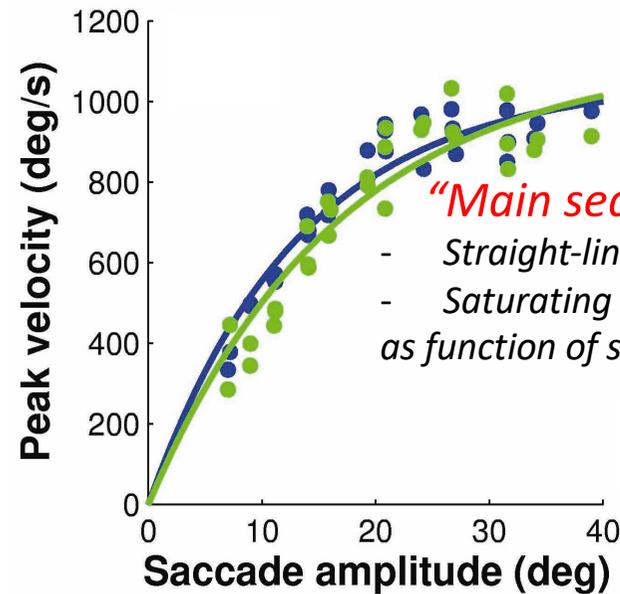
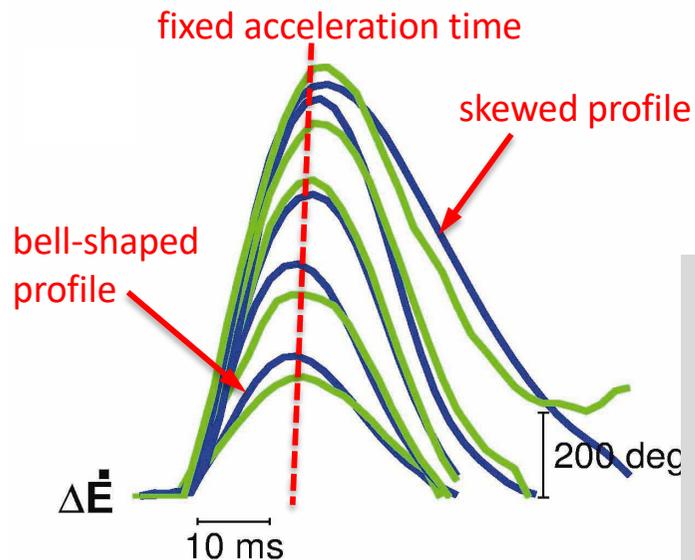
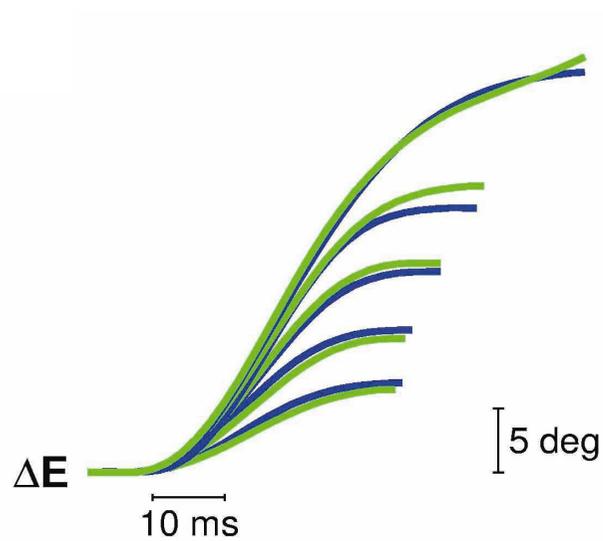
PSTH

2. Saccades: kinematics

2

Saccade Kinematics: nonlinear main sequence

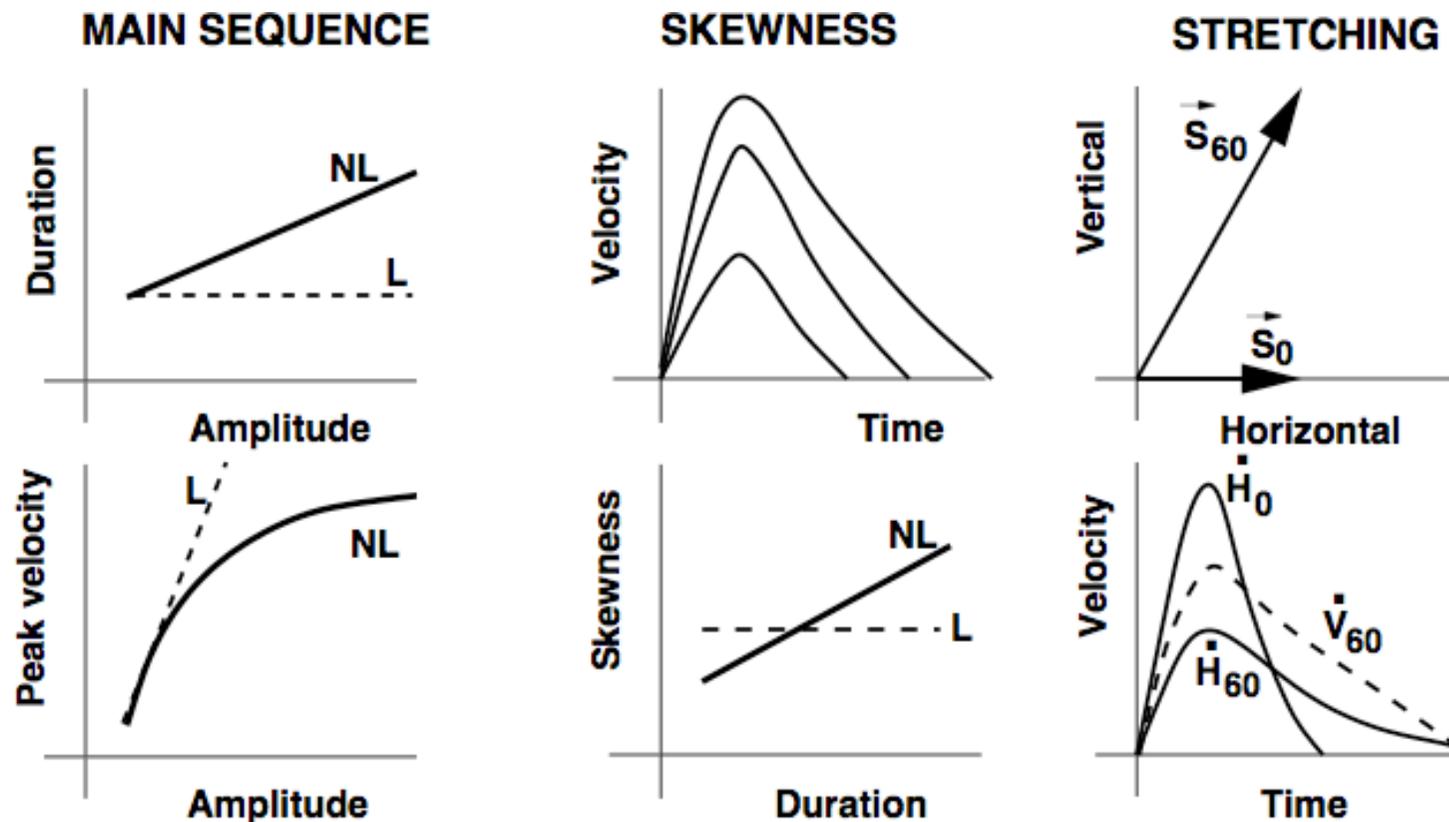
2. Saccades: kinematics



The PULSE contains all the properties seen in the saccade kinematics (velocity profiles).

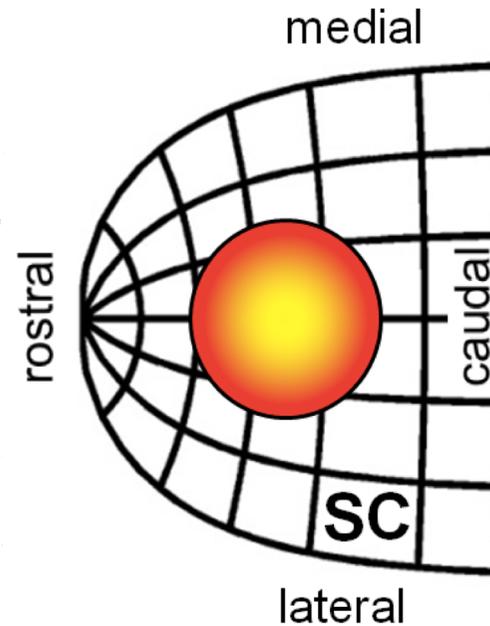
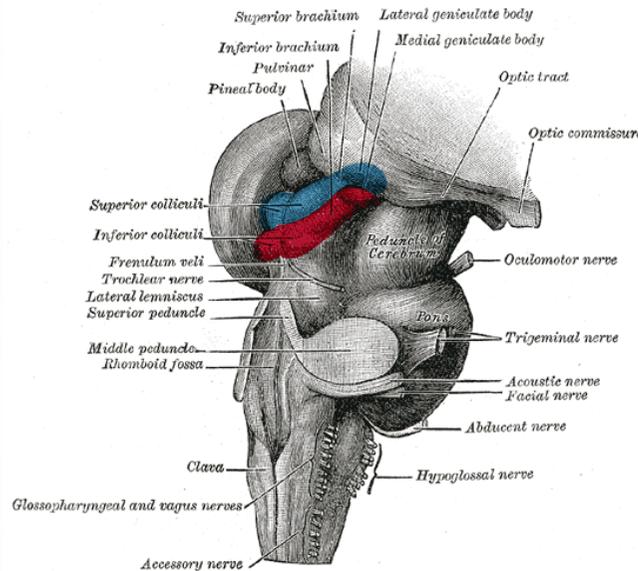
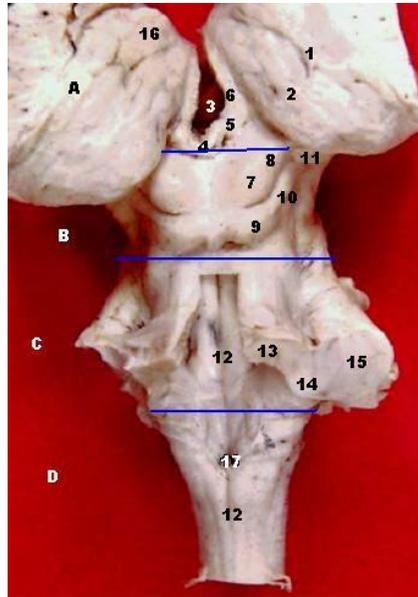
Because of the main sequence the saccadic pulse controller must be **nonlinear!**

2. Saccades: nonlinear kinematics



- **Main sequence:** the stereotyped relation between amplitude, duration and peak velocity betray a **nonlinearity** in the system
- **Skewness** of velocity profiles increases with saccade duration
- Oblique saccades are straight because of **component stretching**

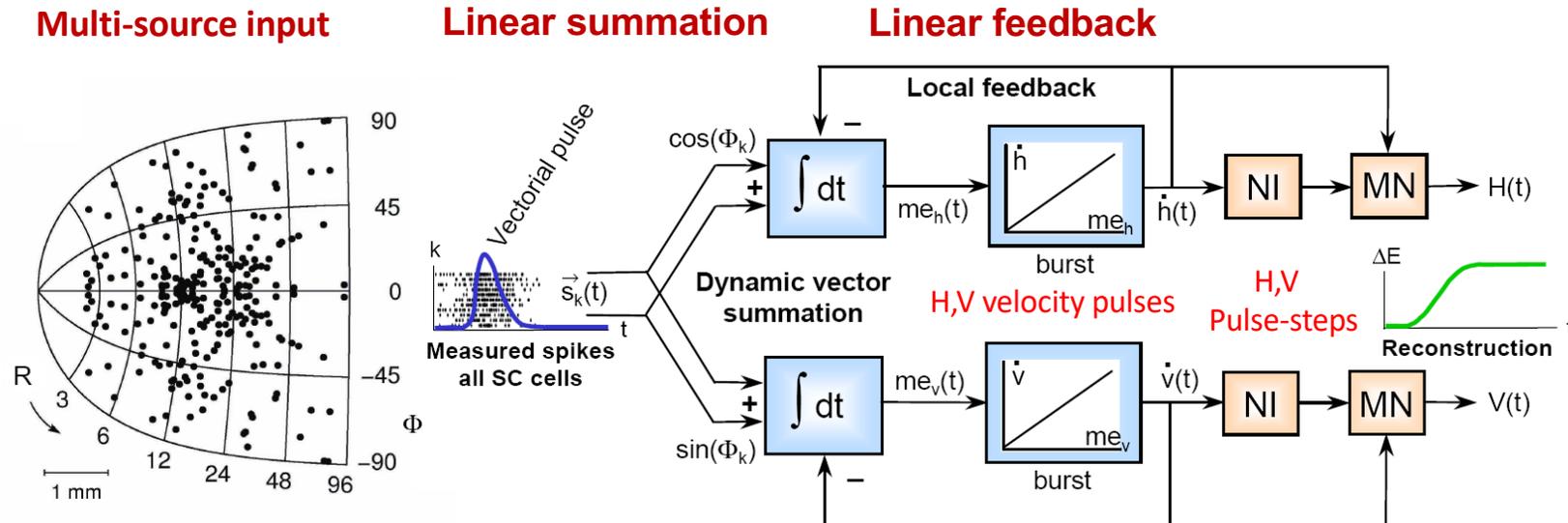
2. Saccades: nonlinear kinematics



∃ Saccadic gaze-motor map in the SC, in which a local population encodes the eye-head saccade.

- Recent theoretical studies suggest that the nonlinear main-sequence relations reflect a **deliberate strategy** to **optimize speed-accuracy trade-off** in the presence of **signal-dependent noise**
- The **midbrain Superior Colliculus** is in an **ideal position** to **implement** such an **optimal control principle** because it is a key sensory-motor interface for saccades
- **Previous findings from my lab**: main-sequence properties of saccades are indeed reflected in the spatial-temporal activity patterns of the SC.

2. SC motor map is a nonlinear, vectorial pulse generator

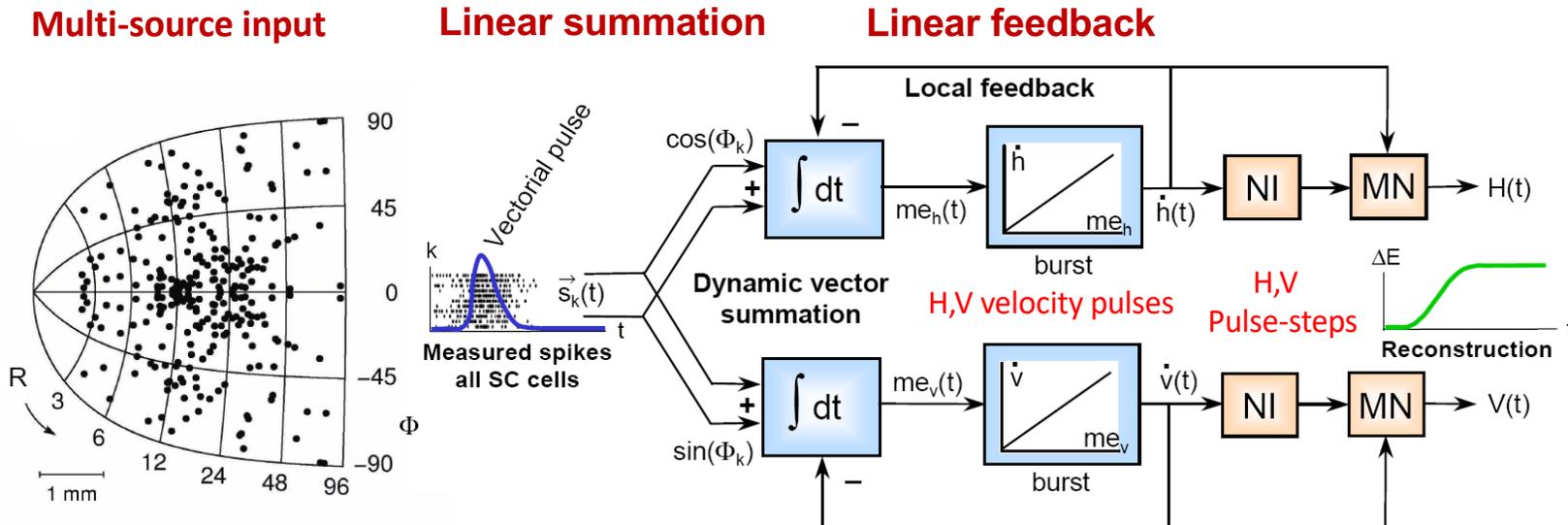


Our model (from neurophysiology):

- Each spike from each SC neuron adds an infinitesimal, site-specific, **'2D spike-vector'** contribution to the eye motor command: $\vec{m}_k = [x(u_k, v_k), y(u_k, v_k)]$
- The **intended trajectory** is determined by dynamic **linear vector summation** of all spike vectors:

$$\vec{s}_k(t) = \int_0^t \vec{m}_k \cdot \delta(t - \sigma) d\sigma \Rightarrow \vec{S}(t) = \sum_{k=1}^{POP} \vec{s}_k(t)$$
- We assume **linear feedback circuits** in the brain stem, in which horizontal and vertical **pulse generators are independent**
- Model (only **two free parameters, [B, ΔT]**) is applied to **measured SC activity** patterns (150 cells) for saccades in all directions.

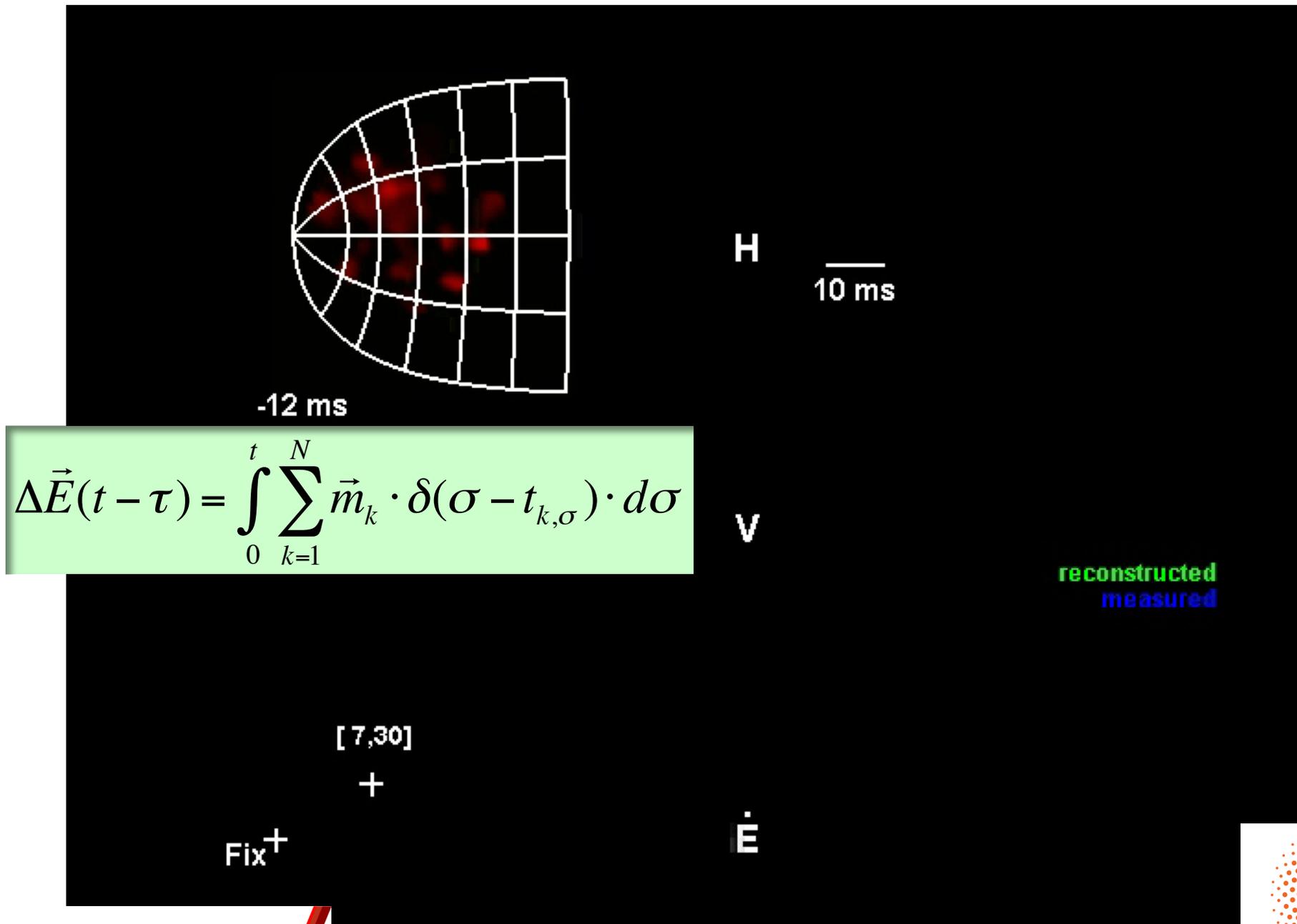
2. SC motor map is a nonlinear, vectorial pulse generator



$$E_{H,V}(s) = \frac{B \cdot SC(s)}{s \cdot (s + B \cdot e^{-s \cdot \Delta T})}$$

The SC output – to – Eye-position output characteristic

2. SC activity encodes the full saccade trajectory and kinematics



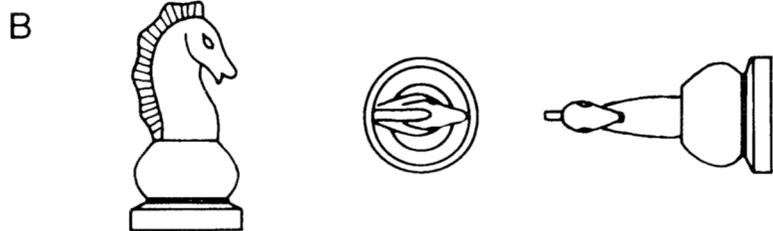
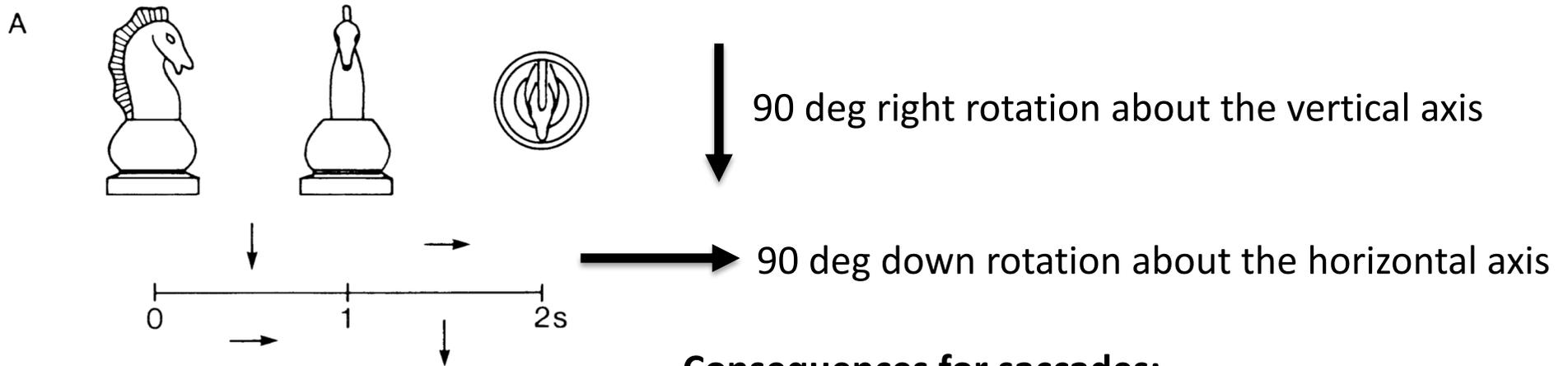
3. 3D Rotational kinematics: How?

3

**The eye is a rotating sphere, with 3 degrees of freedom.
How to deal with the noncommutativity of 3D rotations?**

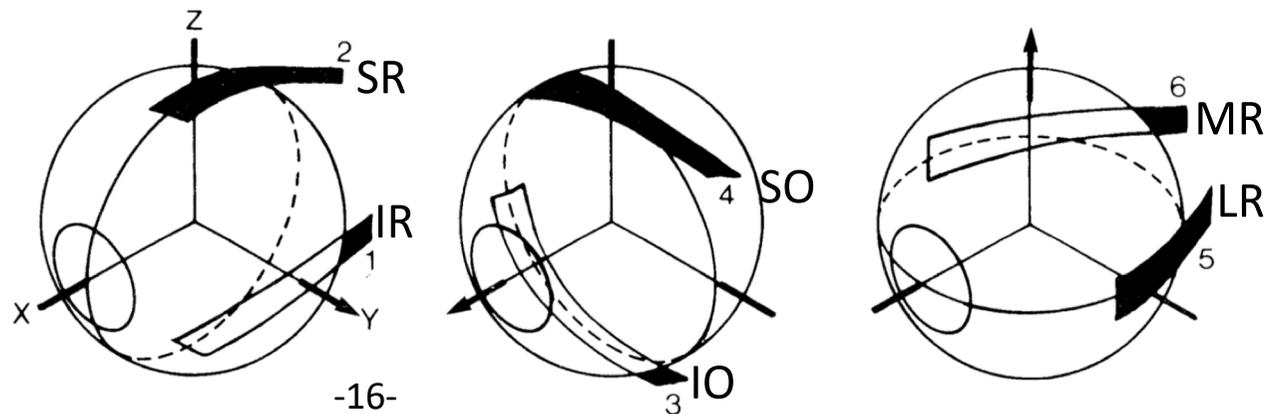
3. 3D Eye-movement kinematics

Rotations do not commute: $R_1R_2 \neq R_2R_1$

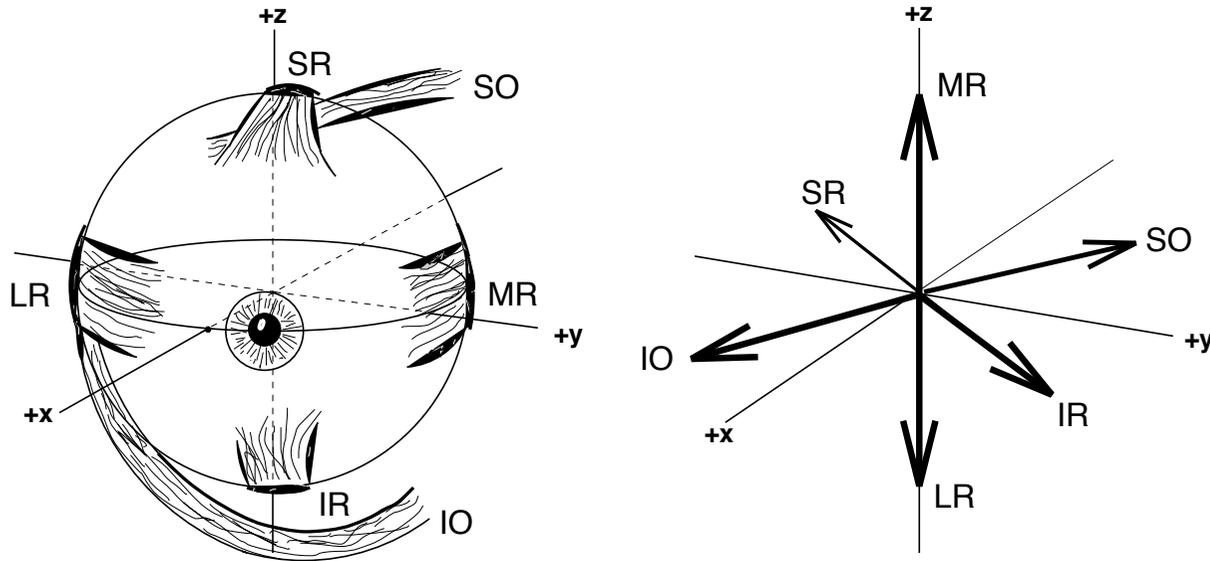


Consequences for saccades:

- For eye-movement sequences (N.B.: we make 3 saccades/s, i.e. >200,000/day), the order of these rotations would determine the final orientation of the eye!
- *This would lead to an accumulation of ocular torsion!*



3. Eye-movement kinematics in 3D:

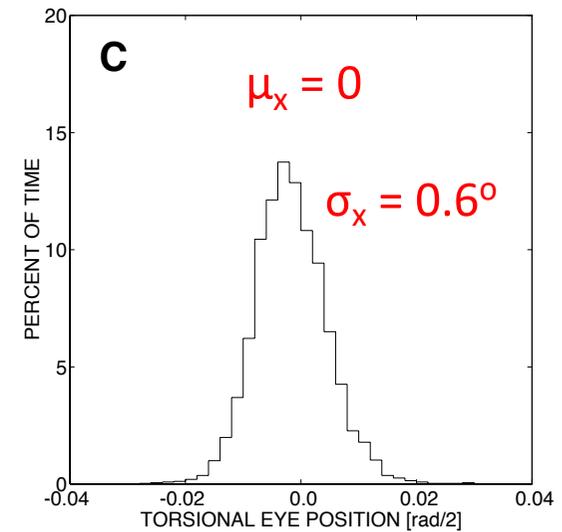
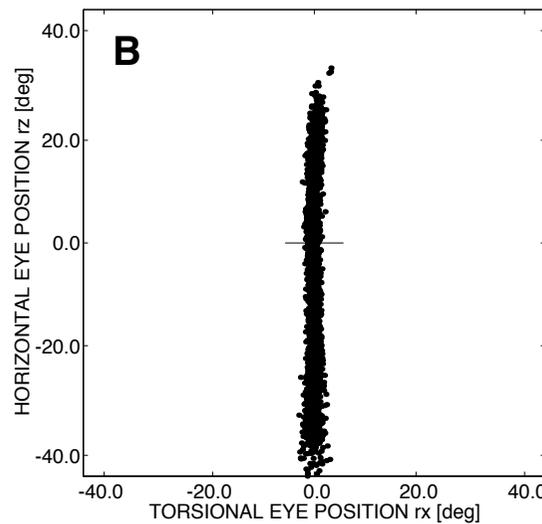
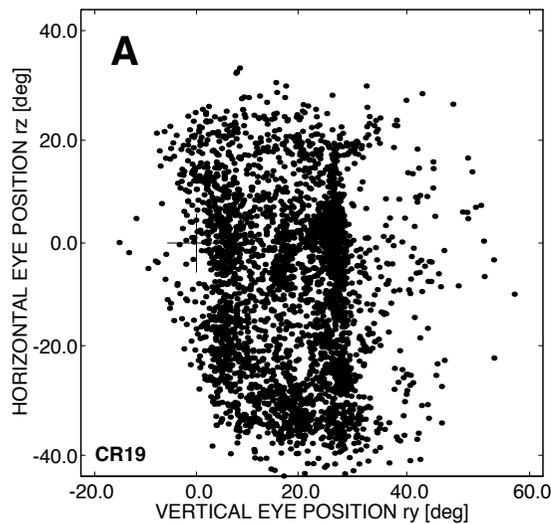


F.C. Donders observed that:

“Regardless the path taken by the eye to reach a gaze direction at (H,V), its torsional orientation is always the same” (Donders’ law).

i.e., **Eye torsion = f(H, V)**
(only 2 degrees of freedom!)

Data: Measured monkey eye orientations in 3D (expressed in quaternion coordinates)

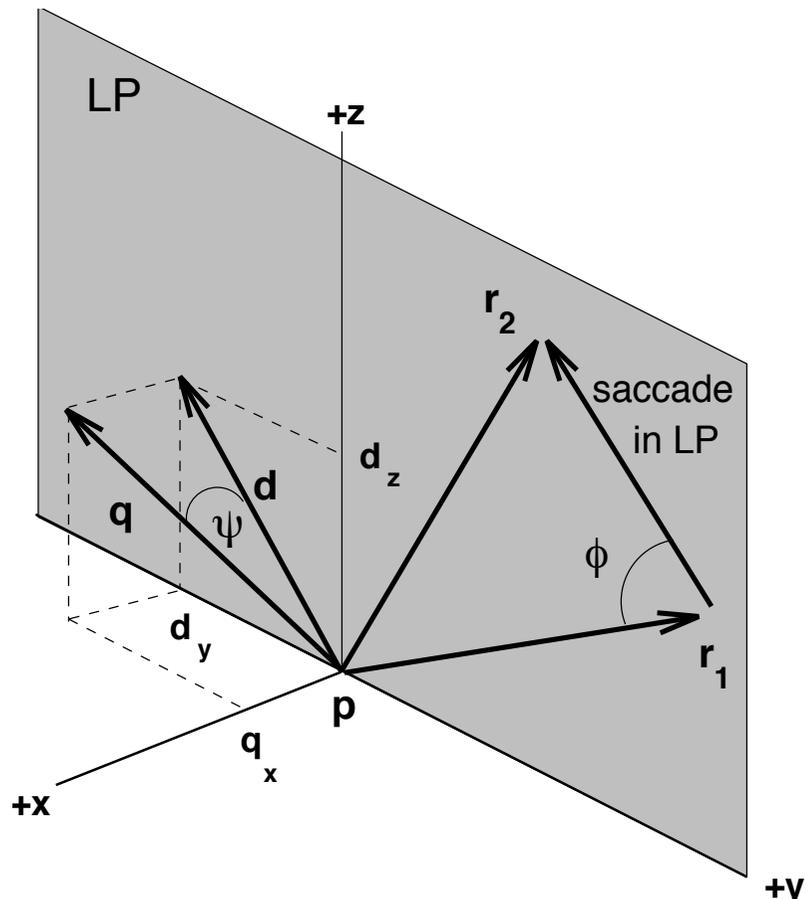


Listing’s law: Ocular torsion, $f(H,V) = r_x = 0$

3. 3D eye-movement kinematics

The behavioural **measurements** show that:

- a saccade can be well approximated by a **single-axis rotation** from start to end
- in 3D rotation-vector coordinates, saccades are **straight lines** (geodesics) in Listing's Plane



To calculate the single rotation axis for the eye, \mathbf{q} , which brings it from $\mathbf{r}_1 = (0, r_{1y}, r_{1z})$ to $\mathbf{r}_2 = (0, r_{2y}, r_{2z})$, we use quaternion calculus:

$$\mathbf{q} = \mathbf{r}_2 \circ \mathbf{r}_1^{-1} = \mathbf{d} + \mathbf{r}_1 \times \mathbf{d}$$

with $\mathbf{d} = \mathbf{r}_2 - \mathbf{r}_1$ the straight-line saccade in LP

and note that:

- \mathbf{q} is parallel to the **angular velocity** vector
- \mathbf{q} has **three** degrees of freedom:

$$q_x = r_{1y}r_{2z} - r_{1z}r_{2y}$$

- but $d_x = 0$
- and also: $d_x(t) = 0 \forall t$

3. 3D Eye-movement kinematics

There is good evidence that Listing's law is **not** caused by the **mechanics** of the eye (as has been suggested by others, e.g. through the action of *eye-muscle pulleys*):

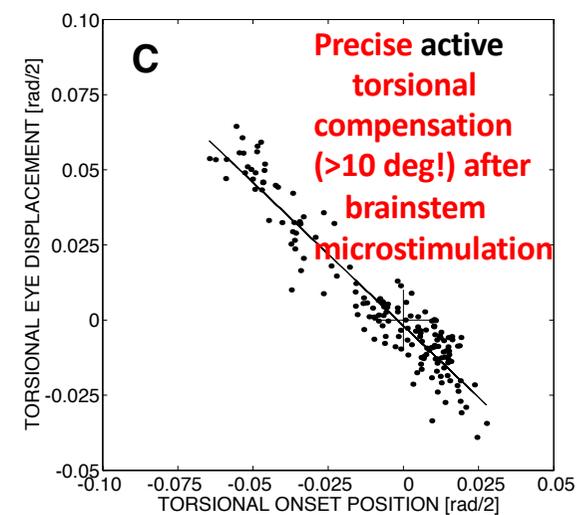
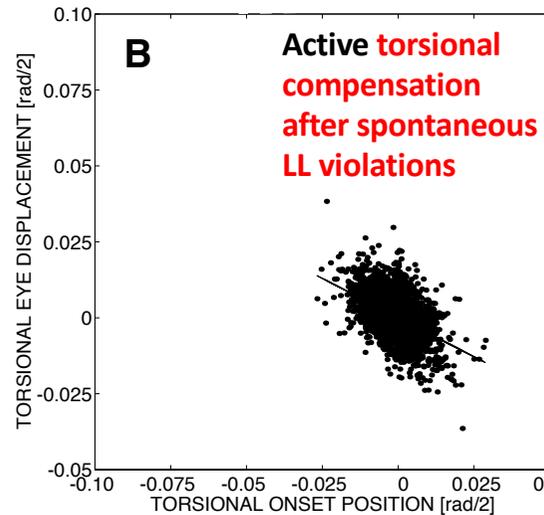
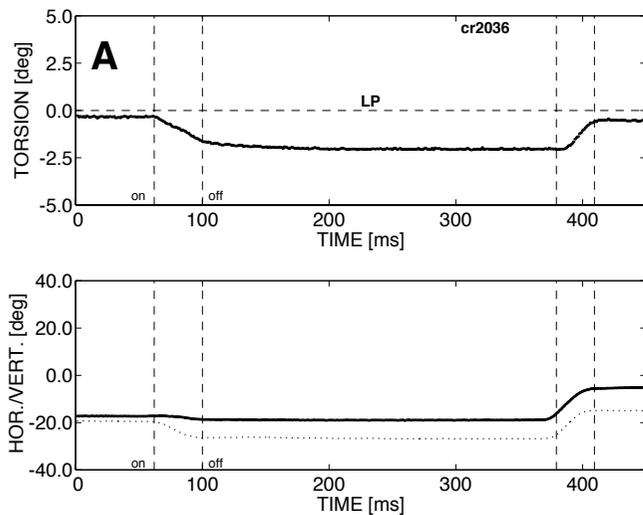
BECAUSE:

- the law is broken for near- (vergence) eye movements ($Eye\ torsion = f(Y)$)
- it is broken during eye-head gaze-shifts ($Eye\ torsion = complex\ function$)
- it is broken when the head is tilted re. gravity ($Eye\ torsion = f(tilt)$)
- it is broken for vestibular-evoked eye movements ($Eye\ torsion = -\eta \cdot (Head\ torsion)$)

AND:

- there is **no torsional drift** after a small spontaneous violation of Listing's law
- the brain **keeps track** of the (small) deviations from Listing's plane between saccades:

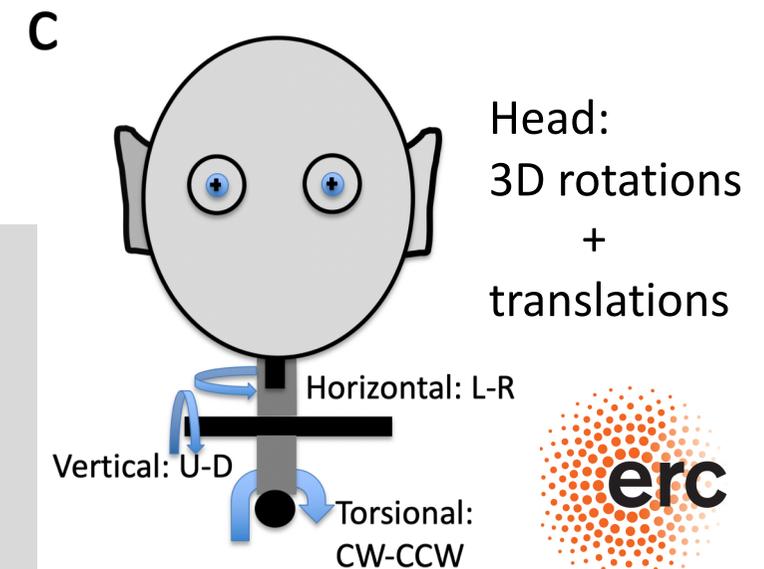
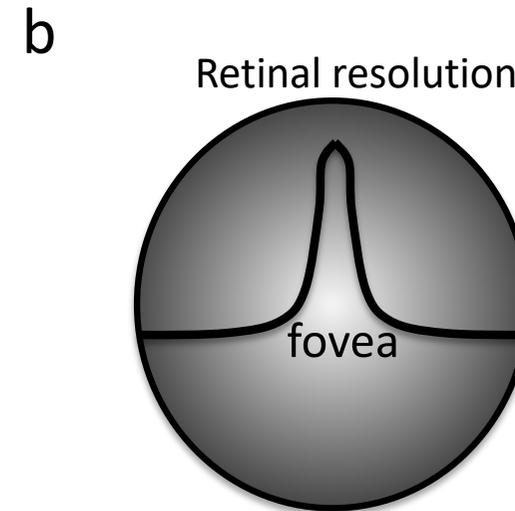
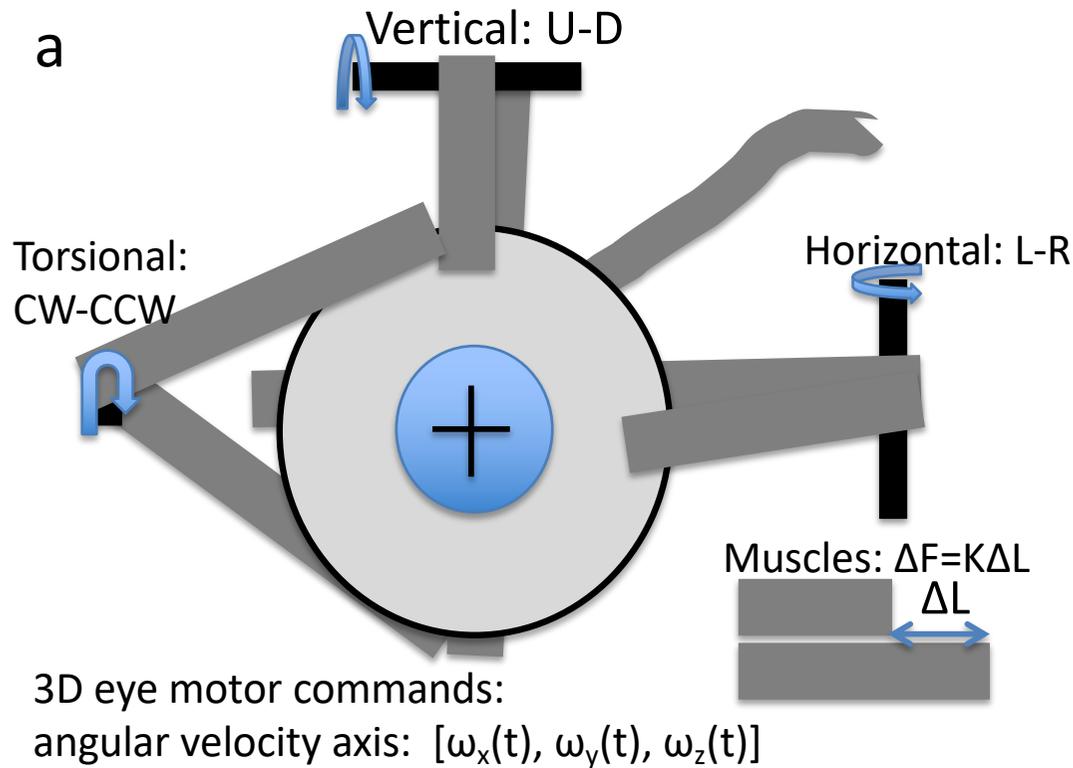
→ voluntary saccades **DO** have 3 degrees of freedom!



→ Listing's law and Donders' law reflect **neural strategies!**

3. 3D Eye-movement kinematics

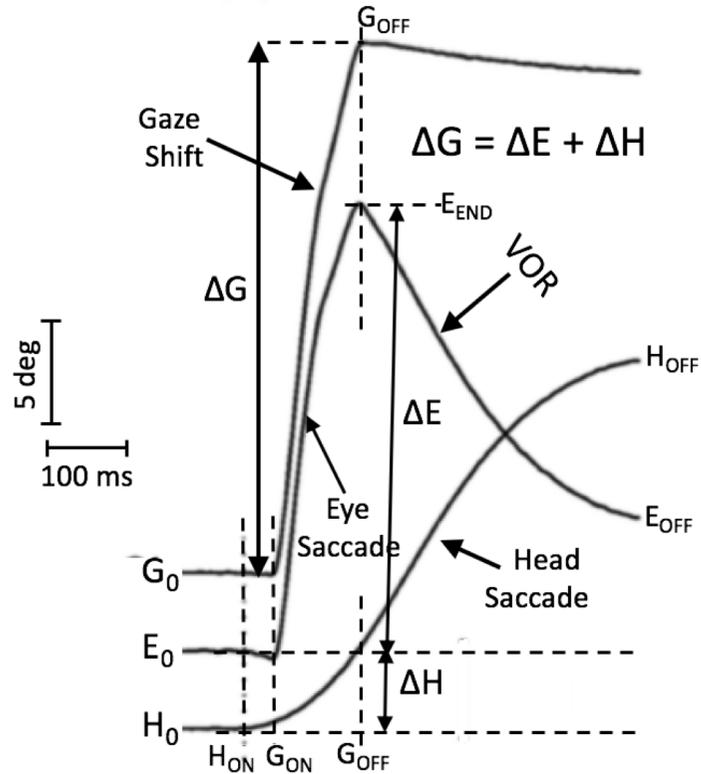
My ERC proposal: “understanding the neural control of eye-head gaze shifts in 3D” through a realistic biomimetic robotic eye-head control system



Inspired by our neural (SC, brainstem, cerebellar) recordings, behavioural measurements (Listing’s law, Donders’ law, extended to eye-head coordination), and computational neural-network models

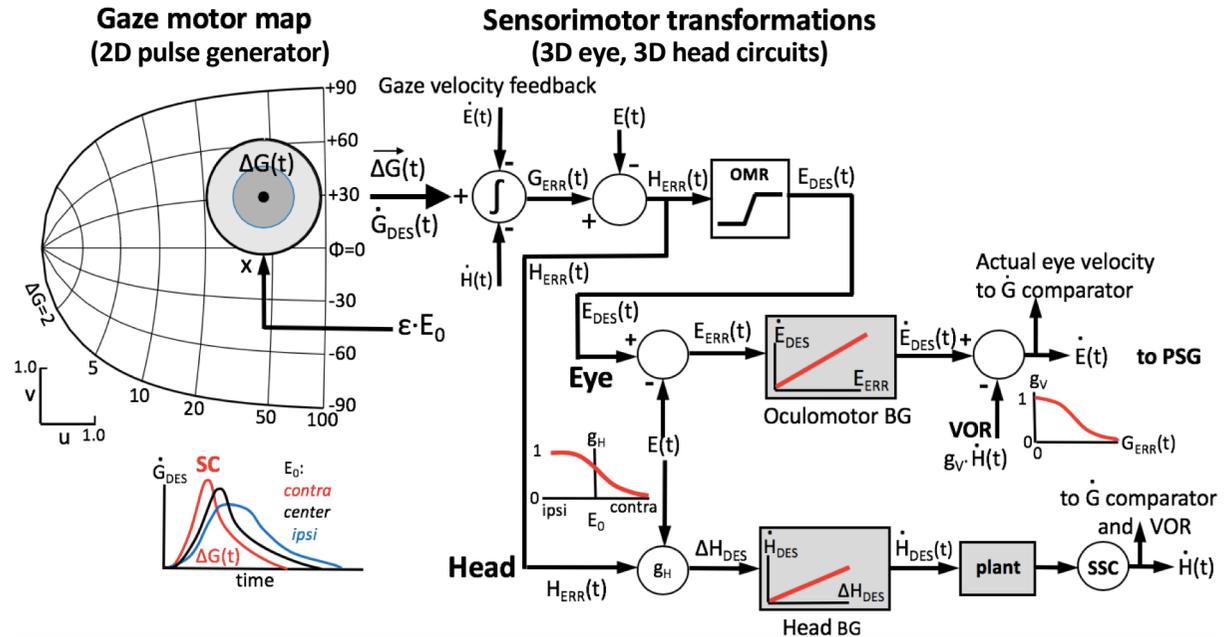
(Optimal control, Bayesian inference, Reinforcement learning, ...)

4. 3D Eye-head saccades



But: behavioural/neural SC recordings show that:

- SC population encodes the **total E-H gaze shift**
- Gaze (the eye orientation in space, $g = e \circ h$) follows Listing's law at the end of the gaze shift



Eye-head gaze saccades:

- Strong involvement of the 3D vestibular-ocular reflex (VOR)
- The head obeys Donders' law, but not Listing's law
- The eye-in-head trajectory no longer obeys either law!
- The eye-in-space trajectories in 3D become quite

complex, as they vary with the eye-in-head and head-movement contributions to the gaze shift!

Our challenges: both computational (Nijmegen) and at the hard- and software implementations (Lisboa)

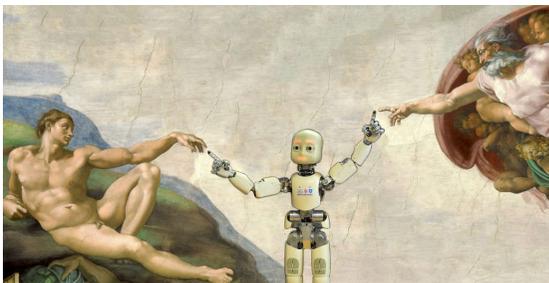
Thank you for your attention!



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