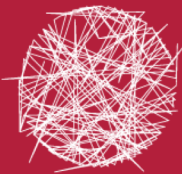


# Model Free Based learning for eye trajectory optimization

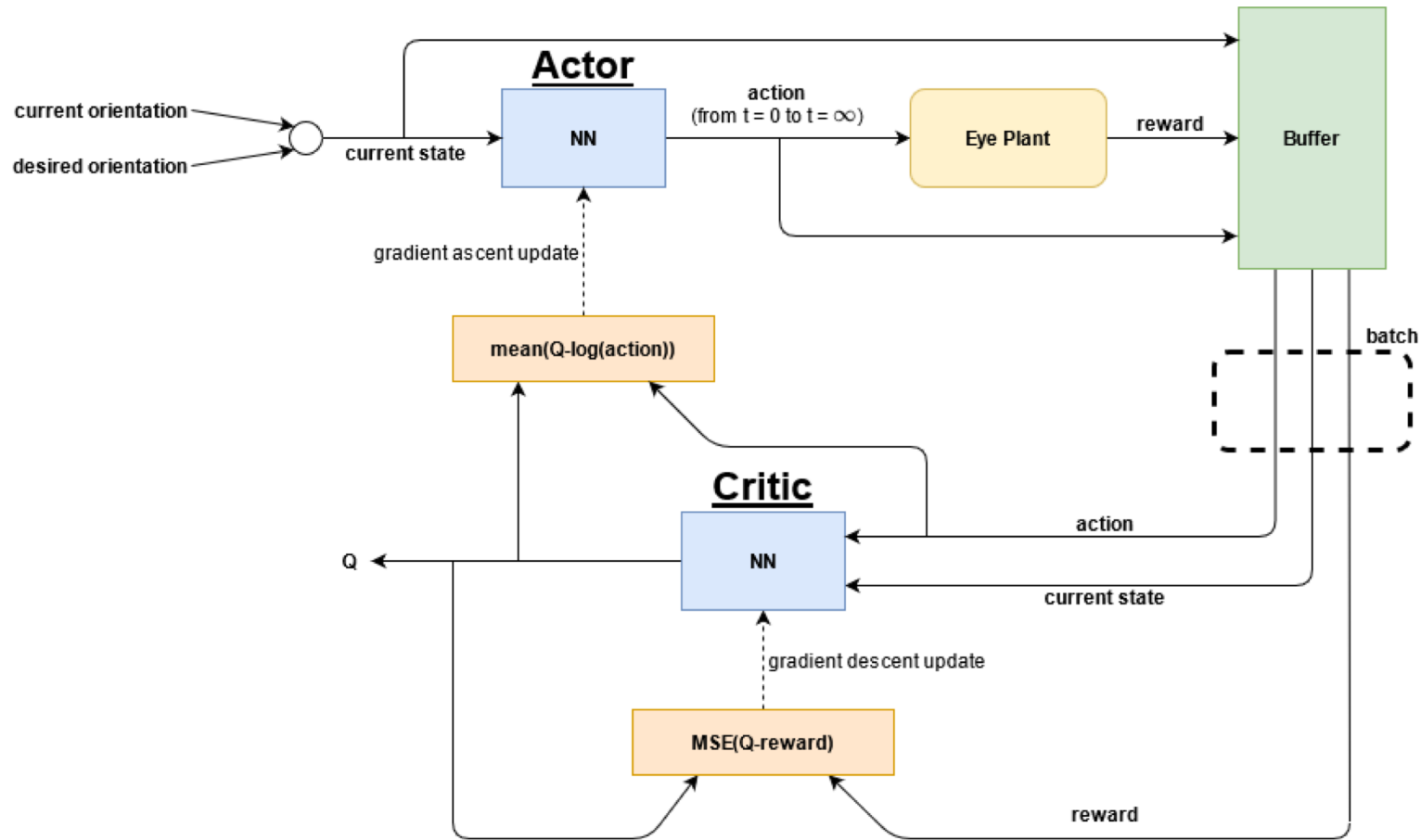
Henrique Granado



# Outline

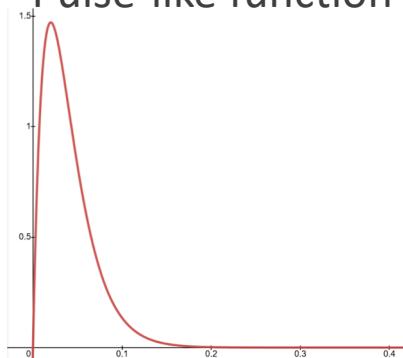
- **Actor-Critic Algorithm**
  - Action
  - Reward
- **Results**
- **Current Work**

# Actor-Critic



# Actions

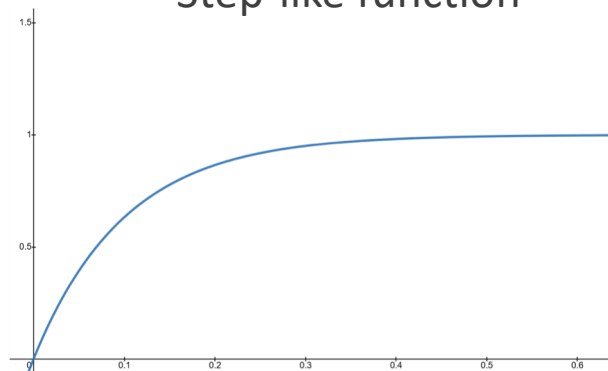
Pulse-like function



$$f_1(x) = A \cdot x \cdot e^{-B \cdot x}$$

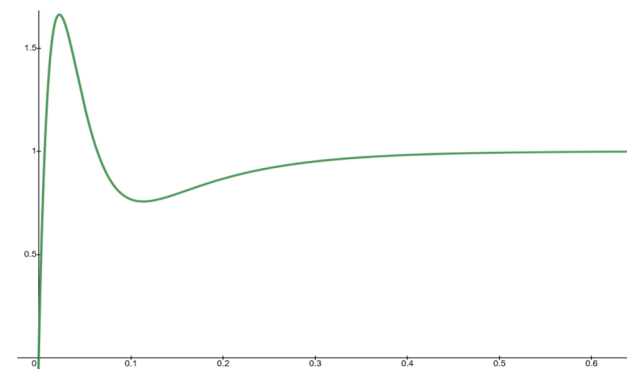
+

Step-like function



$$f_2(x) = (D - F) \cdot (1 - e^{-C \cdot x}) + F$$

=



$$f(x) = A \cdot x \cdot e^{-B \cdot x} + (D - F) \cdot (1 - e^{-C \cdot x}) + F$$

A - ] - ∞, ∞[

B - ]0, ∞[

C - ]0, ∞[

D - Final Motor Position

F - Initial Motor Position ← Known

Determined by the Actor

# Reward

Accuracy:

$$\mathit{regret}_A = -(\mathbf{1} - (q_f \cdot q_d)^2)$$

$q_f$  – final orientation

$q_d$  – desired orientation

Energy:

$$\mathit{regret}_E = -\sum_{i=0}^N (\Delta\tau_i)^2 / \Delta t$$

$\Delta\tau_i$  – change in motor command/rotation

Duration:

$$\mathit{regret}_D = -\left(\mathbf{1} - \frac{1}{1+\beta p}\right)$$

$p$  – time taken to reach final orientation

$$\mathit{total\ regret} = \lambda_A \cdot \mathit{regret}_A + \lambda_E \cdot \mathit{regret}_E + \lambda_D \cdot \mathit{regret}_D$$

# First Steps

Check viability of algorithm:

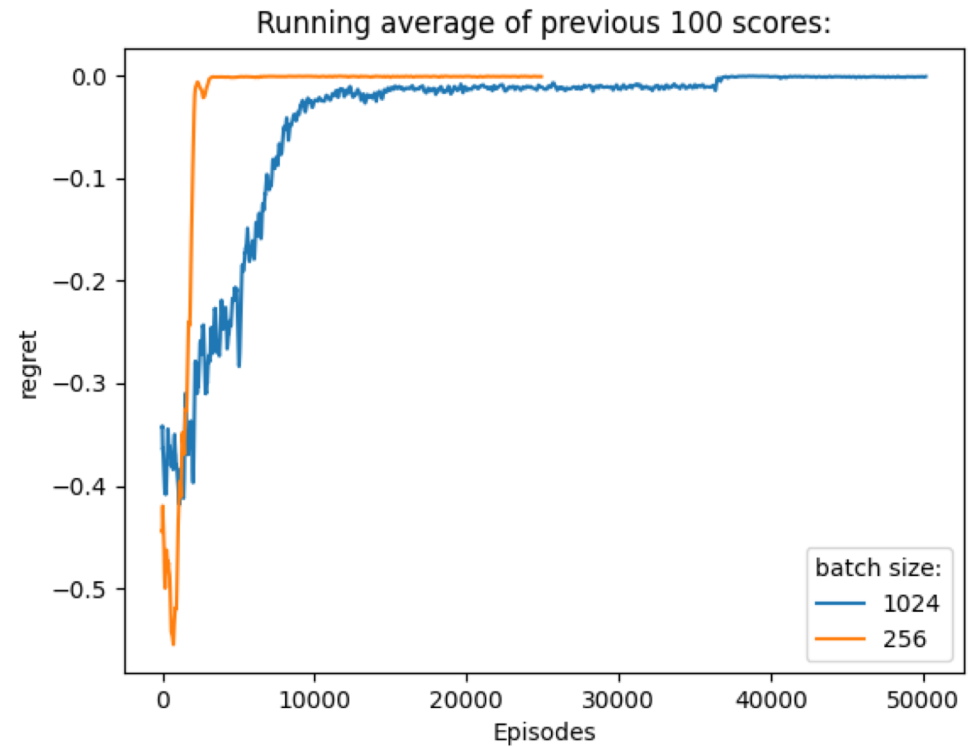
Train only 1 parameter (D) for accuracy only for horizontal movements:

- $Motor\ Position = f(t) = (D - F)H(t) + F$ 
  - D – Final Motor Position
  - F – Initial Motor Position
  - H(t) – Heaviside Function
- $total\ regret = - \left( \mathbf{1} - (q_f \cdot q_d)^2 \right)$ 
  - $q_f$  – final orientation
  - $q_d$  – desired orientation

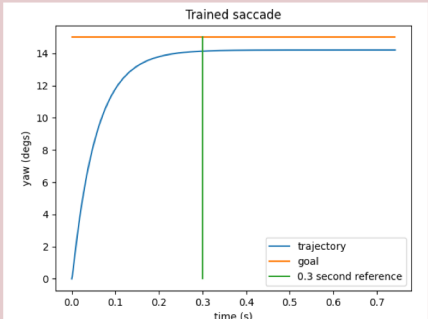
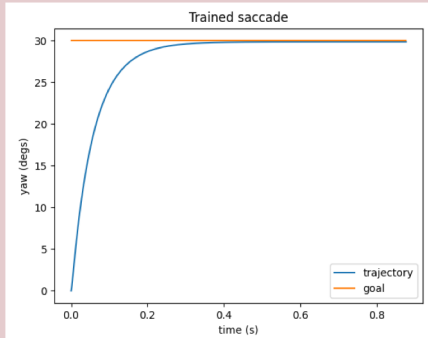
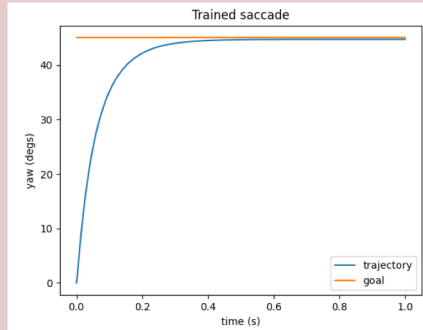
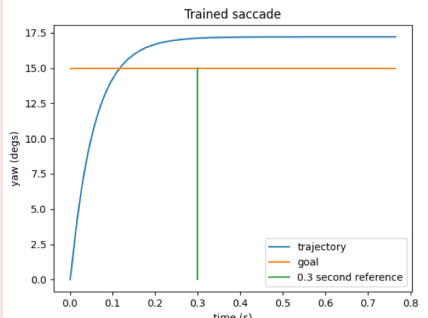
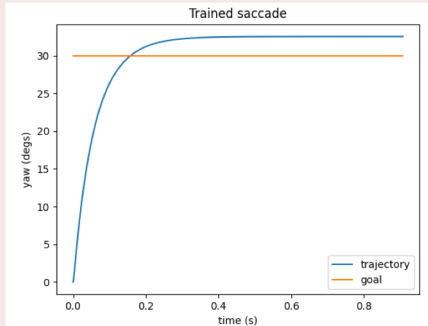
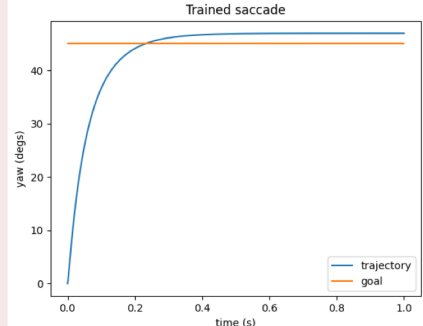
# Results

Two runs of training 1 Actor-Critic for all sized horizontal saccades:

- Actor: MLP with 2 hidden layers with a size of 16 neurons each
- Critic: MLP with 2 hidden layers with a size of 16 neurons each



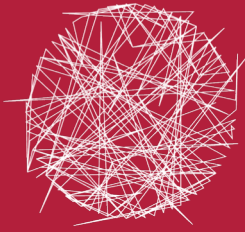
# Verifying Results

Goal	15°	30°	45°
1 <sup>st</sup> Run (1024 batch size)			
2 <sup>nd</sup> Run (256 batch size)			



## Current Work

- *Motor Position* =  $f(t) = (D - F) \cdot (1 - e^{-C \cdot x}) + F$
- *total regret* =  $\lambda_A \cdot \text{regret}_A + \lambda_E \cdot \text{regret}_E + \lambda_D \cdot \text{regret}_D$
- Focusing on finding a good set  $\lambda$  that lead to a good result



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Thank you



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