

*July 19th - July 28th*

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# Progress Presentation

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- ❖ results from experiment 1
- ❖ further experiments
- ❖ is the lowest forest level 0 or 1?





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# Experiment 1

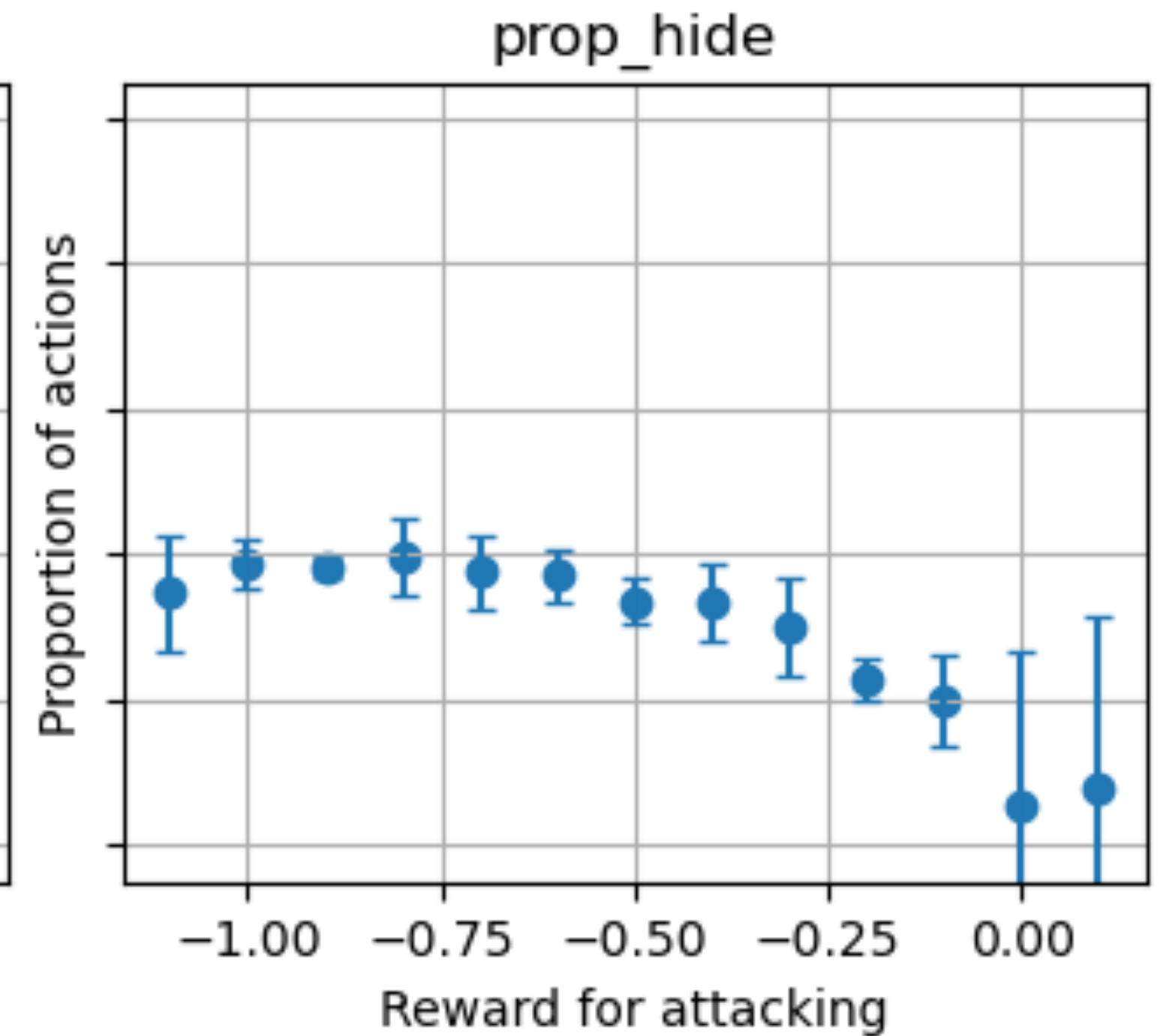
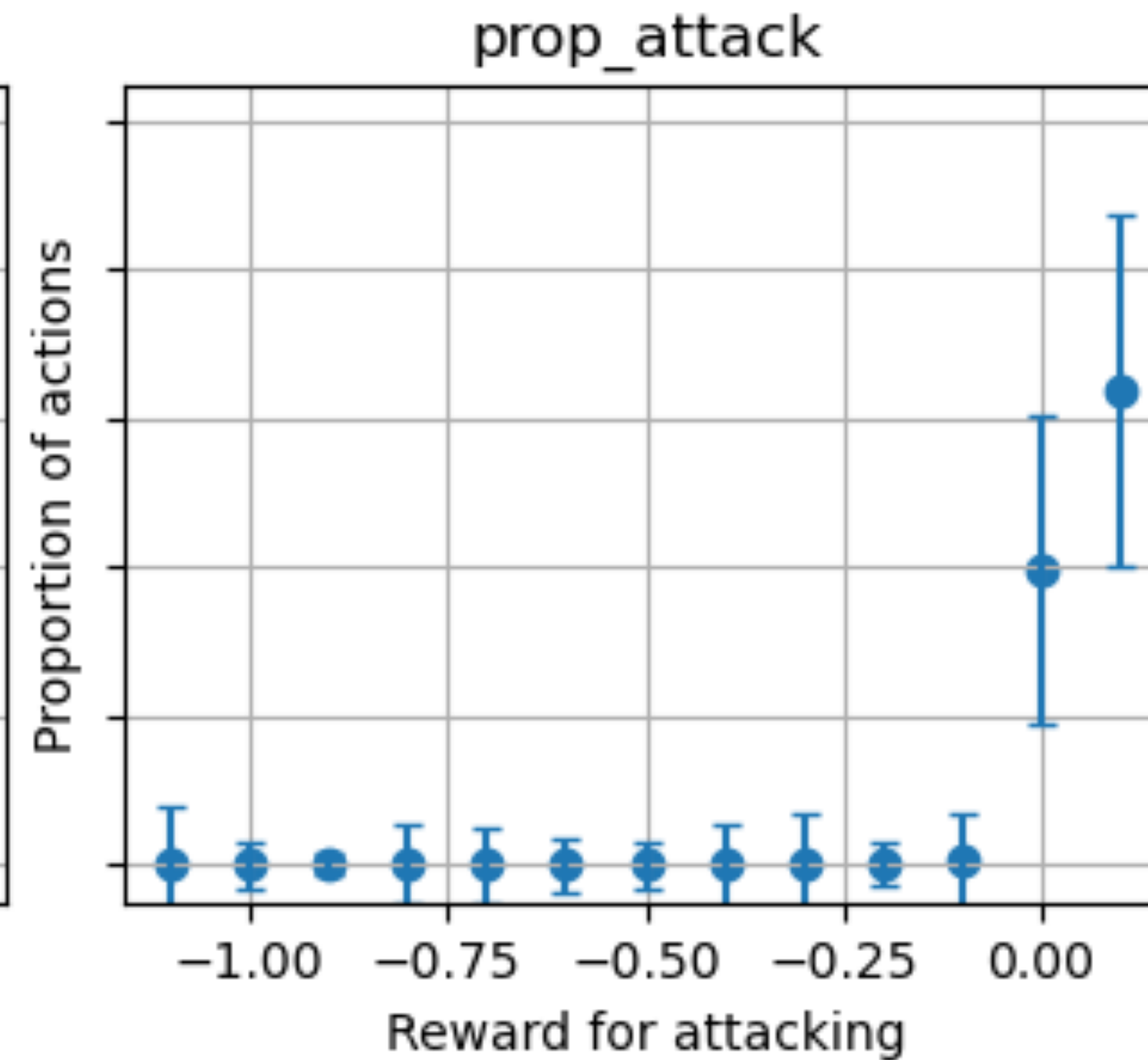
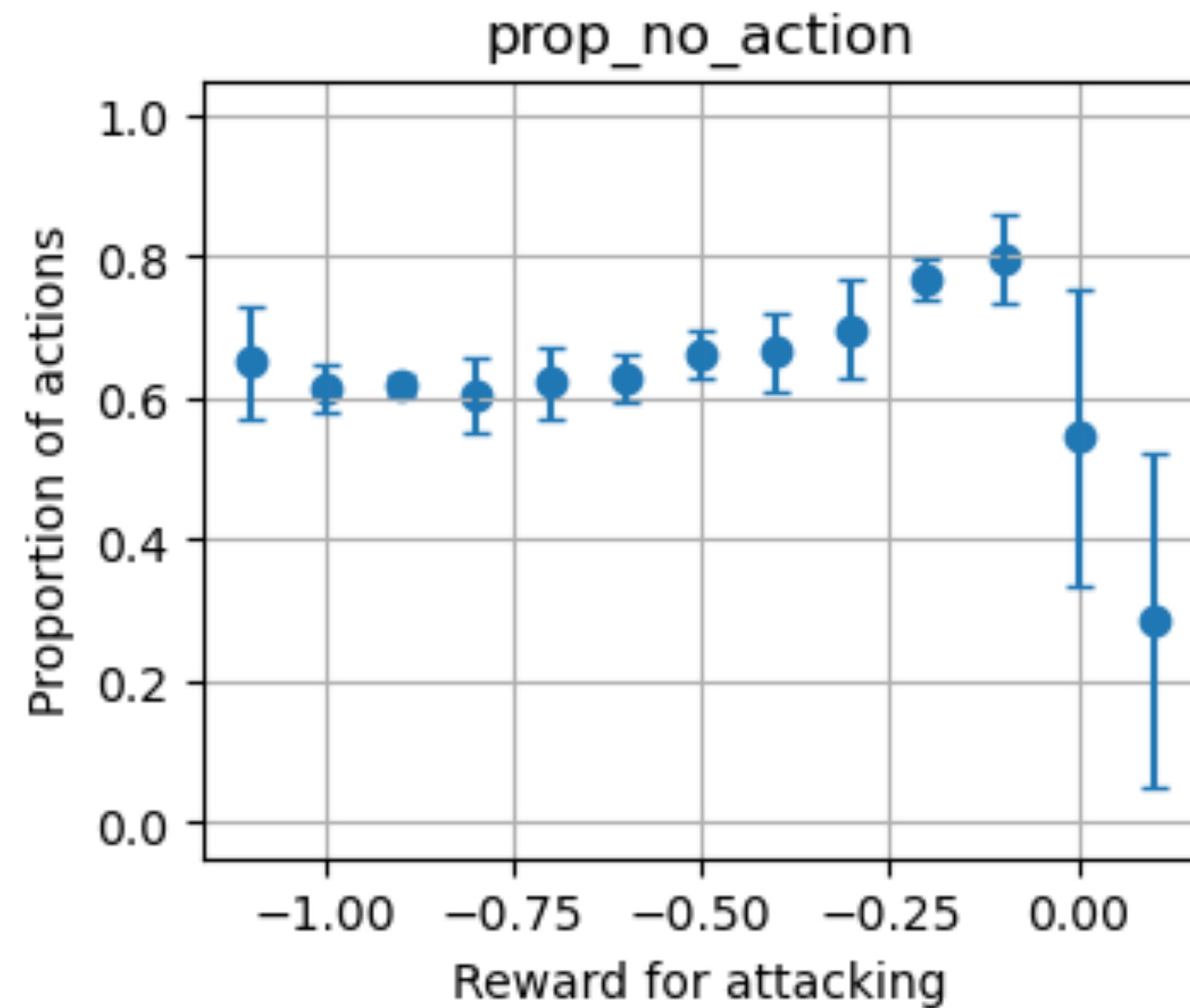
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- ❖ Independent variable: the reward for attacking another civilisation
  - ❖ values tested: -1.1, -1.0, ..., -0.1, 0, 0.1 (13 values)
- ❖ Dependent variables:
  - ❖ proportions of different actions taken
  - ❖ attack streak length distribution
  - ❖ average reward per time step
  - ❖ action utility prediction error



# Experiment 1

*Proportions of Different Actions*





# Experiment 1

*Attack Streak Length Distribution*

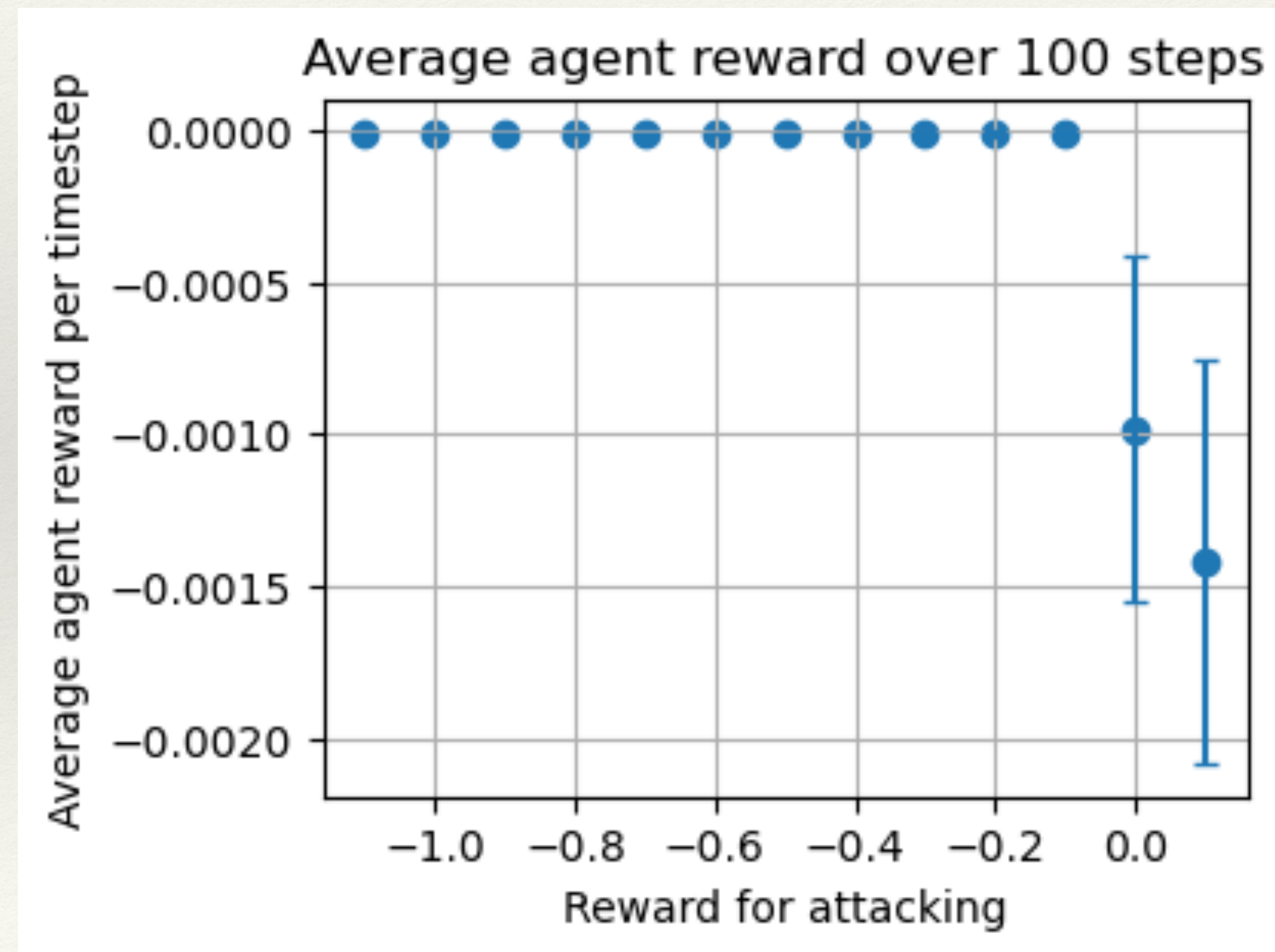


(Should do a few longer runs)



# Experiment 1

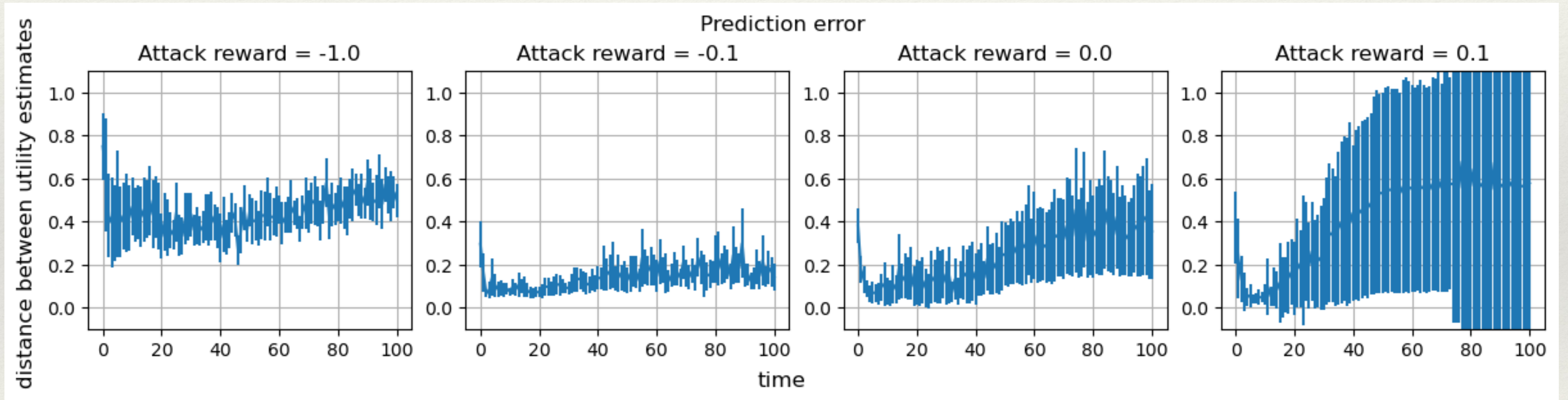
*Average Reward per Time Step*





# Experiment 1

*Prediction Error*

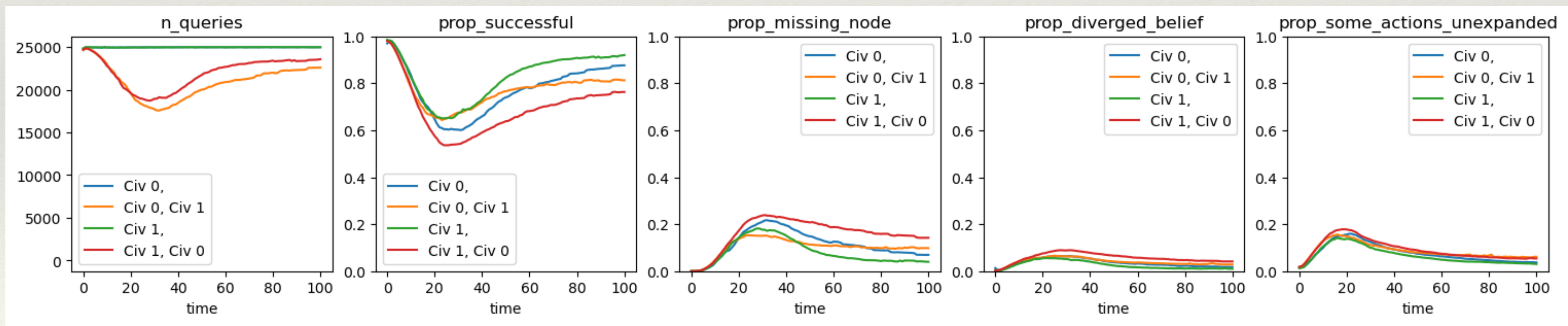


prediction error of  $j$  predicting  $i = \left\| \hat{U}(b_{i,L}, \cdot) - \sum_{is_{j,L}} b_{j,L}(is_{j,L}) \hat{U}(b_{(j,i),L-1}, \cdot) \right\|$  (Note:  $b_{i,L}$  and  $b_{j,L}$  are from separate I-POMDPs)



# Experiment 1

*Lower Forest Query Success Rate*





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# Further Experiments

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Which one to focus on?

1. investigating the **algorithm** (convergence of utility estimates, beliefs, ...)
2. investigating the **optimal policy** computed by the algorithm (beliefs under which it is optimal to attack, ...)
3. investigating the **resulting system** of agents acting according to the optimal policy (attack streak length distribution, ...)



# Is the lowest level forest level 0 or 1?

subintentional models. Second level beliefs are defined in terms of first level models and so on.

Formally, define spaces:

$$\begin{aligned}
 IS_{i,0} &= S, & \Theta_{j,0} &= \{\langle b_{j,0}, \hat{\theta}_j \rangle : b_{j,0} \in \Delta(IS_{j,0})\}, & M_{j,0} &= \Theta_{j,0} \cup SM_j \\
 IS_{i,1} &= S \times M_{j,0}, & \Theta_{j,1} &= \{\langle b_{j,1}, \hat{\theta}_j \rangle : b_{j,1} \in \Delta(IS_{j,1})\}, & M_{j,1} &= \Theta_{j,1} \cup M_{j,0} \\
 &\vdots & & \vdots & & \\
 &\vdots & & \vdots & & \\
 &\vdots & & \vdots & & \\
 IS_{i,l} &= S \times M_{j,l-1}, & \Theta_{j,l} &= \{\langle b_{j,l}, \hat{\theta}_j \rangle : b_{j,l} \in \Delta(IS_{j,l})\}, & M_{j,l} &= \Theta_{j,l} \cup M_{j,l-1}
 \end{aligned}$$

“Subintentional models”,  
e.g. uniform random

**Definition 4 (Finitely Nested LPOMDP)** A finitely nested LPOMDP of agent  $i$  LPOMDP $_i$  is:

**Level 0:** the interactive states hold a state. The other agents taking random actions creates a POMDP for the level 0 agent (where only the agent itself acts) in which the transition and observation functions are different. But rewards also become random

**Level 1:** the level 1 interactive states hold a state and implicitly the subintentional model for other agents (that they act randomly)



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# Notes from Meeting

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- ❖ Sudden jump in number of attacks when `attack_reward = 0`: could be evidence of a “phase transition” / criticality
- ❖ slope of attack streak length distribution is of interest
- ❖ behaviour of prediction error for `attack_reward=0.1` seems odd — check calculations
- ❖ likewise, behaviour of lower forest query success rate seems quite unusual
- ❖ to the question of whether lowest level is 0 or 1: 0 is intuitively preferable, but use your judgment
- ❖ **Experiment 2:** more agents, don't vary attack reward (keep at 0). Do longer runs: run until the attack streak length distribution doesn't change significantly
- ❖ **Experiment 3:** used to confirm the results of experiment 1 on a more global level.
  - ❖ Vary reasoning level (0 or 1), reward (but in a smaller, more interesting range), `softargmax` coefficient (determine range) and discount coefficient.
  - ❖ Do a Saltelli sample (no 2nd order terms), maybe 128 samples at first (can do more later if needed)
  - ❖ Plot same as experiment 1, but show average over all runs (letting the other parameters vary)