

# Atari Breakout with $LTL_f$ / $LDL_f$ Goals

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Intro.

Q-Learning brief description.

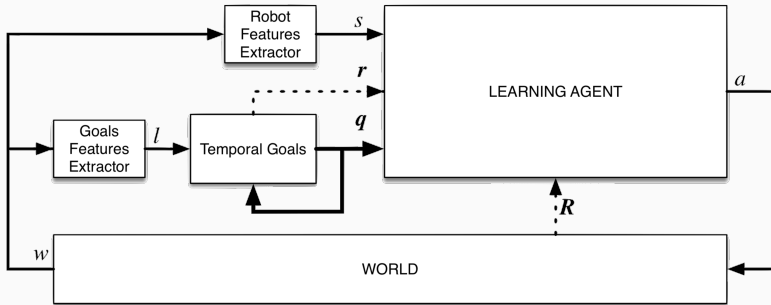
$$Q(S_t, A_t) \leftarrow Q(S_t, A_t) + \alpha \left[ R_{t+1} + \gamma \max_a Q(S_{t+1}, a) - Q(S_t, A_t) \right]$$

SARSA brief description.

$$Q(S_t, A_t) \leftarrow Q(S_t, A_t) + \alpha \left[ R_{t+1} + \gamma Q(S_{t+1}, A_{t+1}) - Q(S_t, A_t) \right]$$

# $LTL_f / LDL_f$ Non-Markovian Rewards

$LTL_f / LDL_f$  non-Markovian rewards + integration in our project.



**Figure 1:** Pipeline describing how the agent is interacting with the world and how the robot features extractor and the goal features extractor are used in order to handle non-Markovian rewards.

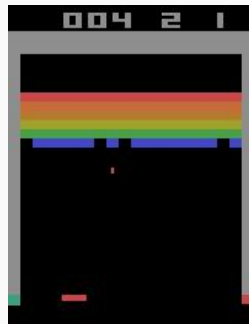
Results of the paper and our starting point.

# PyGame Breakout (6×18)

Our results on 6×18 non-Atari Breakout + video.

# Atari Breakout

Introduction to Gym + ALE  
Differences with non-Atari Breakout (initial hypotheses)





# Implementation

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Algorithms.

Algorithms.

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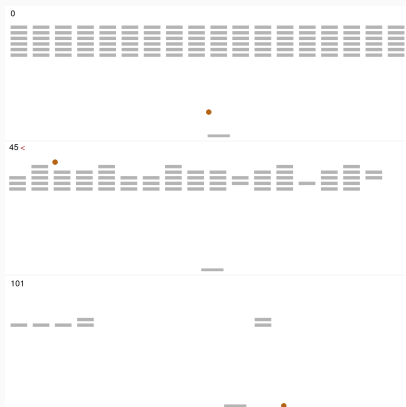
# Experiments

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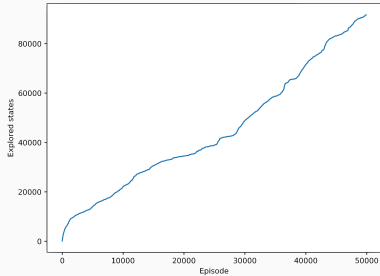
All the experiments.

# Experiments

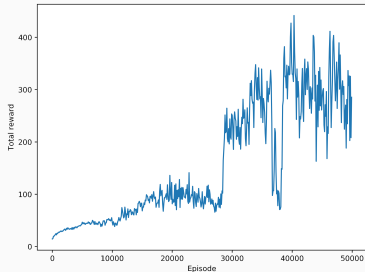


Description.

# Experiments



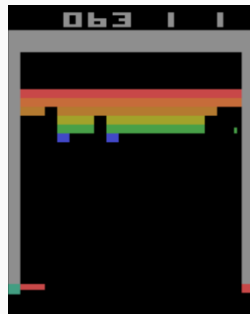
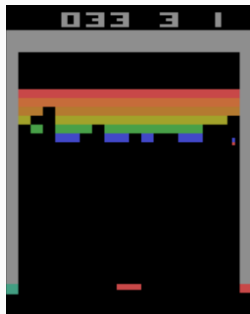
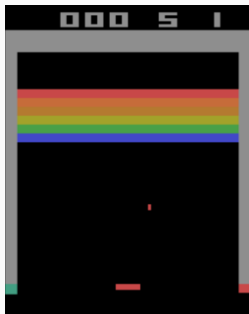
PyGame SARSA.



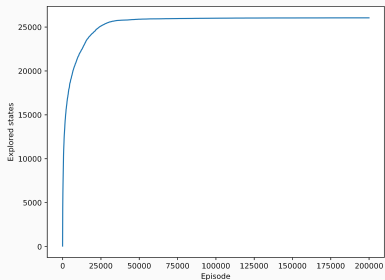


# Experiments

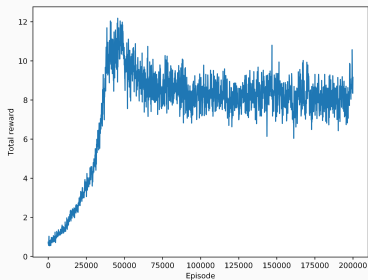
Atari frames.



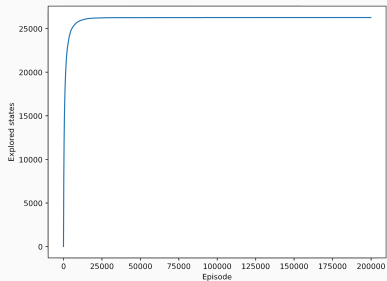
# Experiments



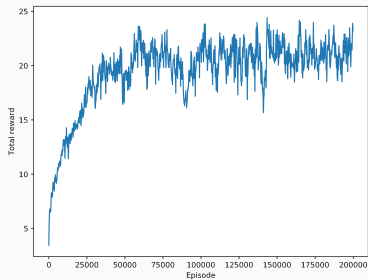
Atari Q-Learning.



# Experiments



Atari SARSA.



# Conclusion

Conclusion.

Q&A

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