## Reinforcement learning

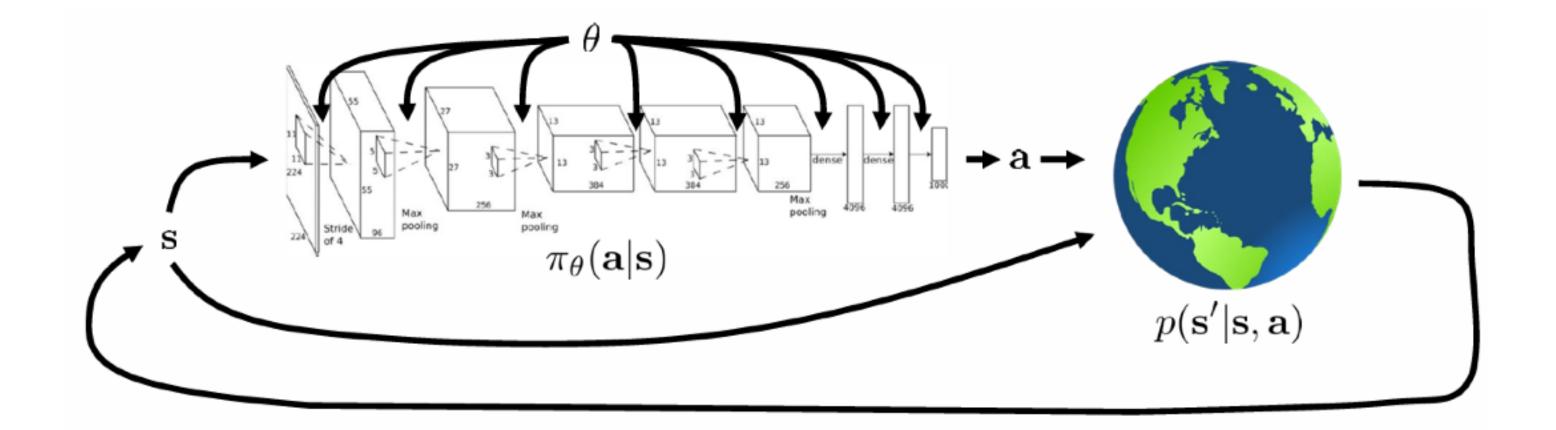
- •Observe initial state  $s_0$
- •For every round t = 1, ..., T
  - •Take action  $a_t$

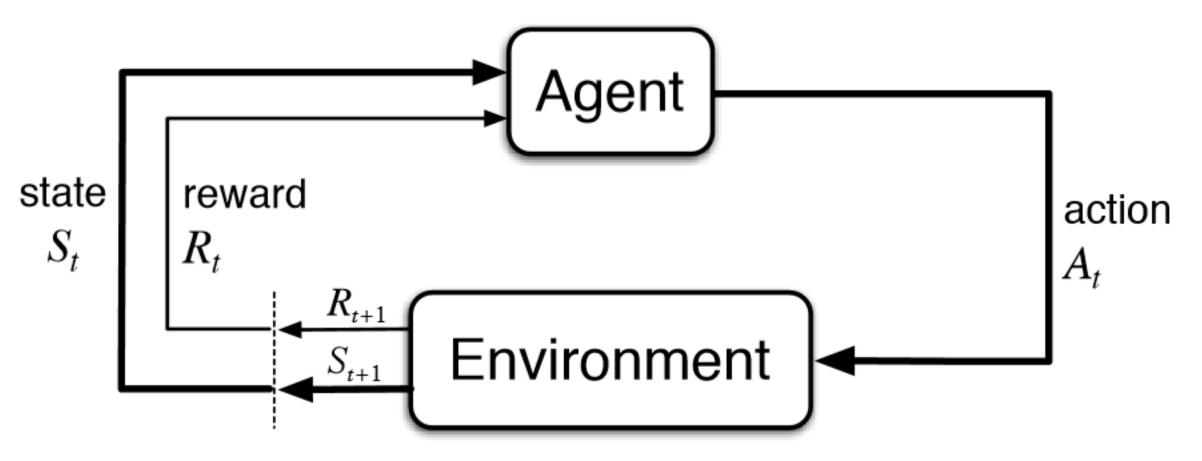


Goal: Find policy  $\pi$  which is a mapping from state to action such

that expected reward over  ${\cal T}$  rounds is maximized

$$\sum_{t=1}^{T} \mathbb{E}_{a_t \sim \pi(\cdot|s_t), s_{t+1} \sim \mathbb{P}(\cdot|s_t, a_t)} [\gamma^{t-1} r_t(s_t, a_t) \mid s_0]$$





## Atari Breakthrough (2013, DeepMind)

## **Breakout**



**Initial performance** 

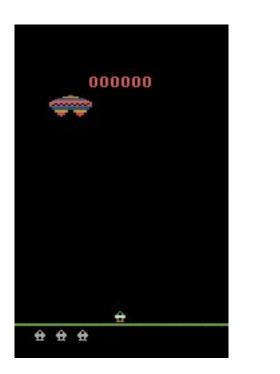


After 15 mins of training

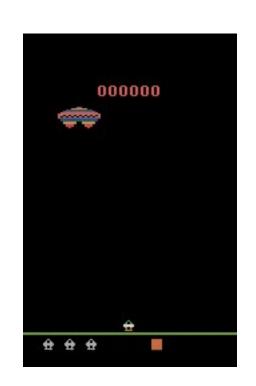


After 30 mins of training

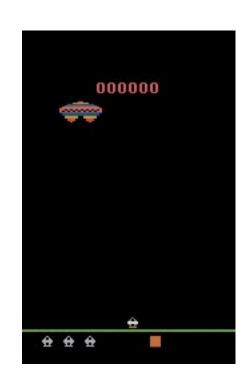
## **Assault**



**Initial performance** 



After 15 mins of training



After 30 mins of training

