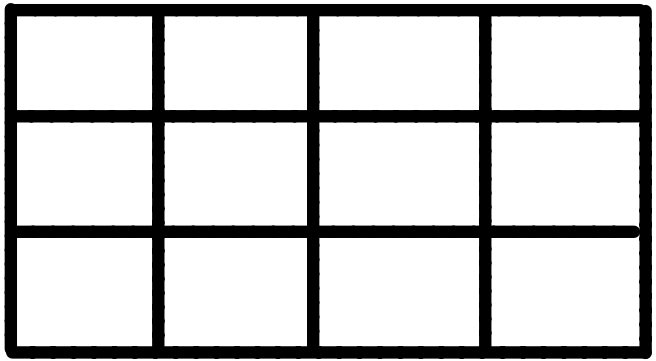
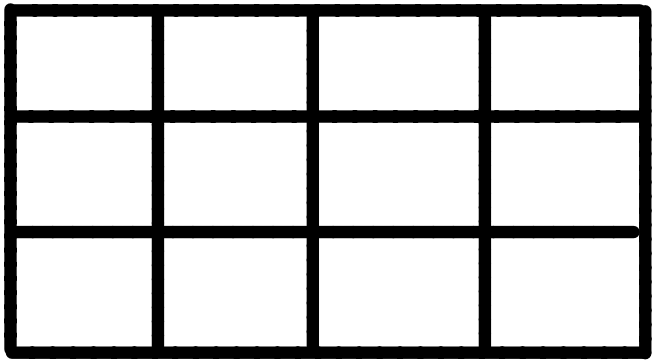
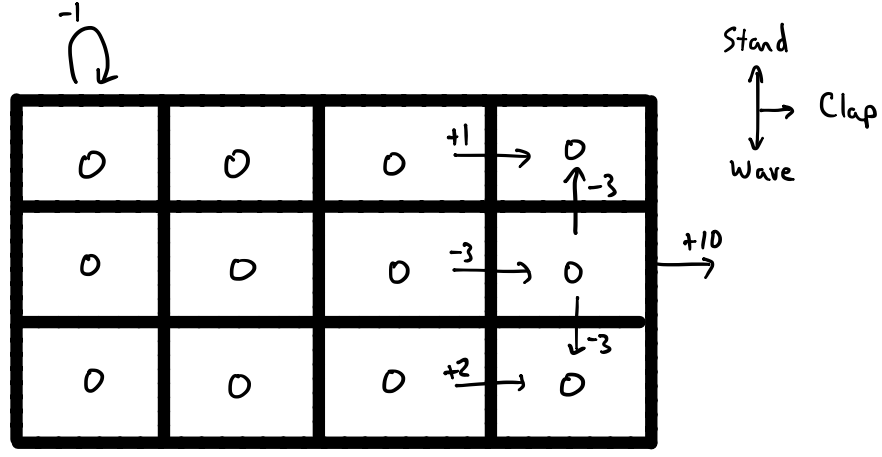


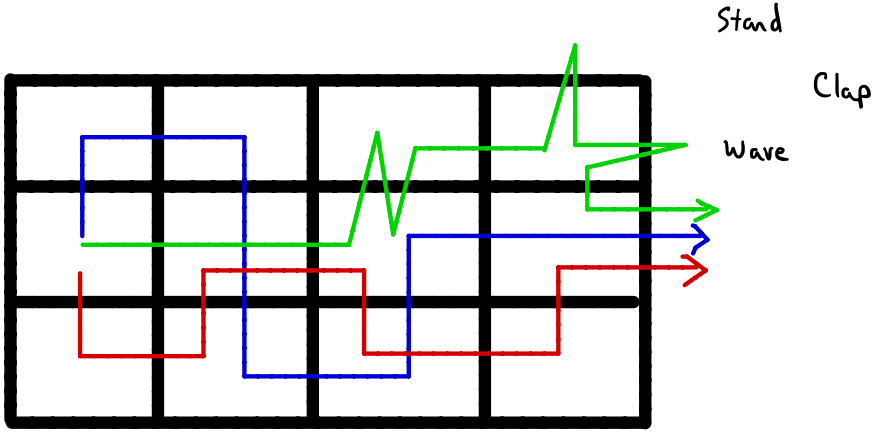
Stand

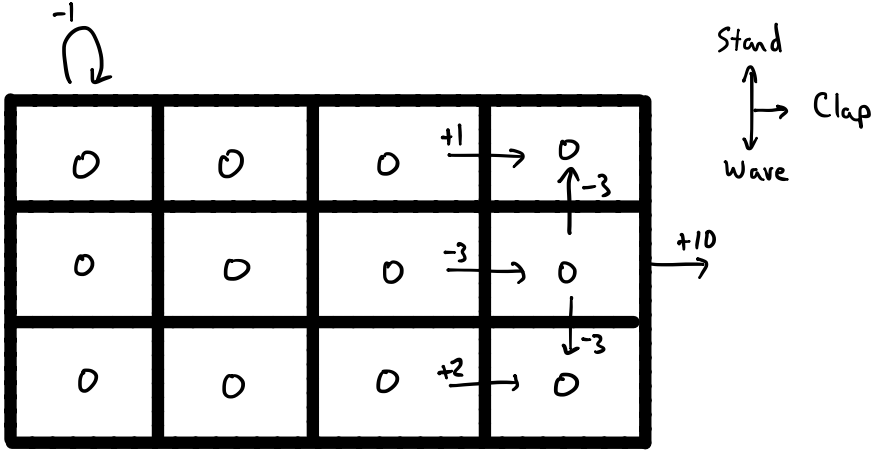
Clap

Wave

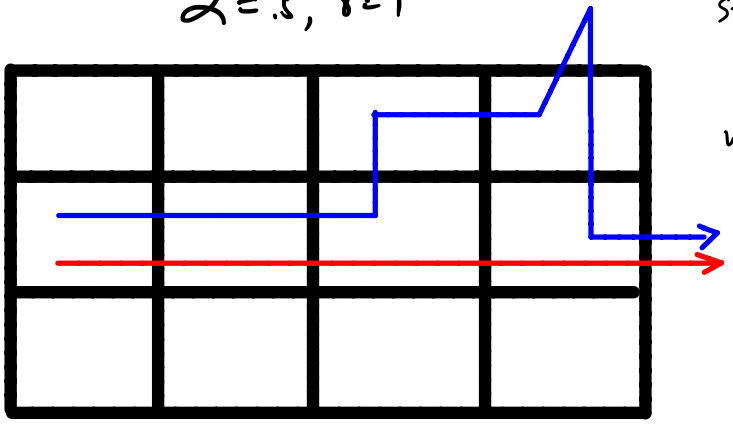

Stand
Clap
Wave


-1
0
0
0
+1
0
-3
0
0
0
-3
0
+10
0
0
0
-3
0
0
0
+2
0
Stand
Clap
Wave


Stand
Clap
Wave


-1
0
0
0
+1
0
-3
0
0
0
-3
0
+10
-3
0
0
0
+2
0
Stand
Clap
Wave

$\alpha = .5, \gamma = 1$



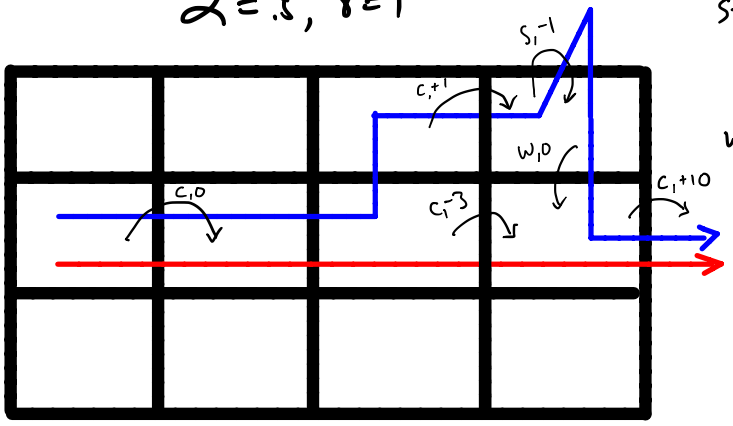
Stand

Clap

Wave

0	0	.5	-.25
0	0	1	1.5
0	0	0	0

$\alpha = .5, \gamma = 1$



Stand

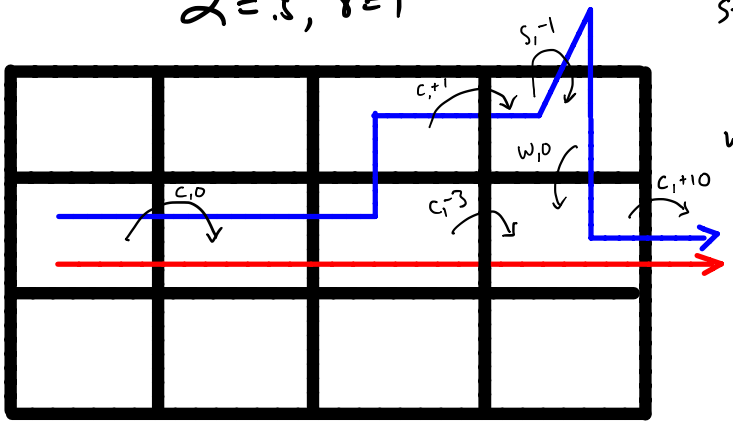
Clap

Wave

0	0	.5	-.25
0	0	1	7.5
0	0	0	0

			?

$\alpha = .5, \gamma = 1$



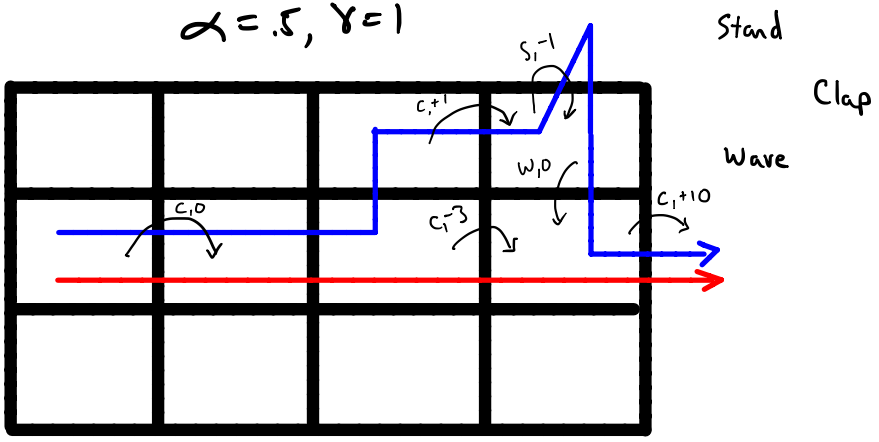
Stand

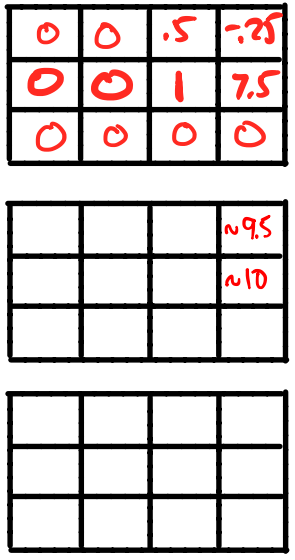
Clap

Wave

0	0	.5	-.25
0	0	1	7.5
0	0	0	0

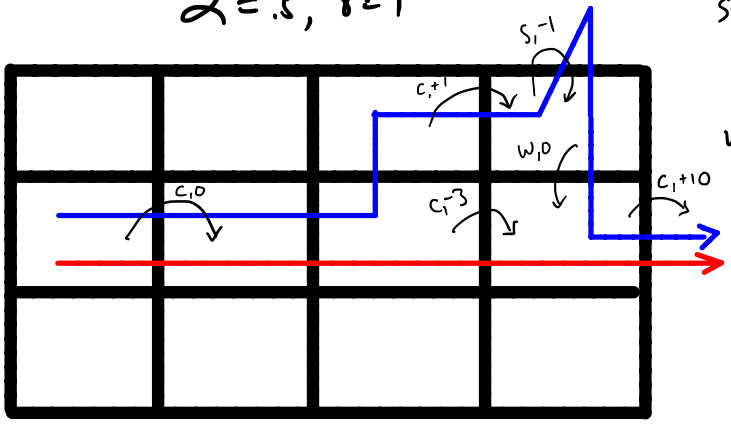
		?	?
		?	≈10





* Dyna-Q learns Q values so (↑, 9) and (↓, 10)

$\alpha = .5, \gamma = 1$



Stand

Clap

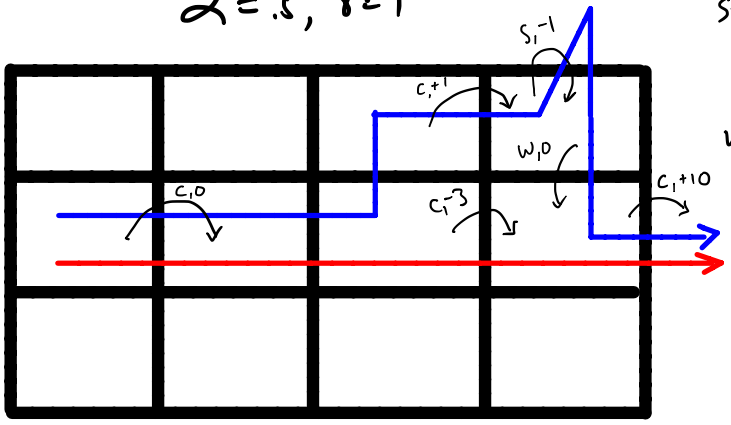
Wave

0	0	.5	-.25
0	0	1	7.5
0	0	0	0

		~10.5	~9.5
~8.75	~8.75	~8.75	~10

on policy

$\alpha = .5, \gamma = 1$



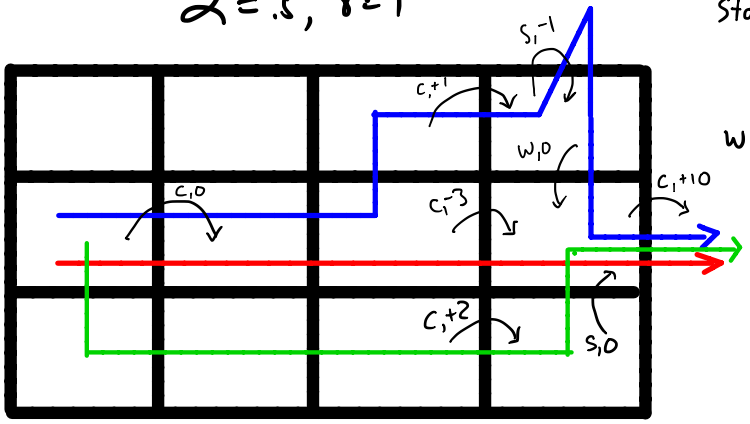
0	0	.5	-.25
0	0	1	7.5
0	0	0	0

		~10.5	~9.5
~8.75	~8.75	~8.75	~10

on policy

- What about unvisited states?
- What if transition function were stochastic?

$\alpha = .5, \gamma = 1$



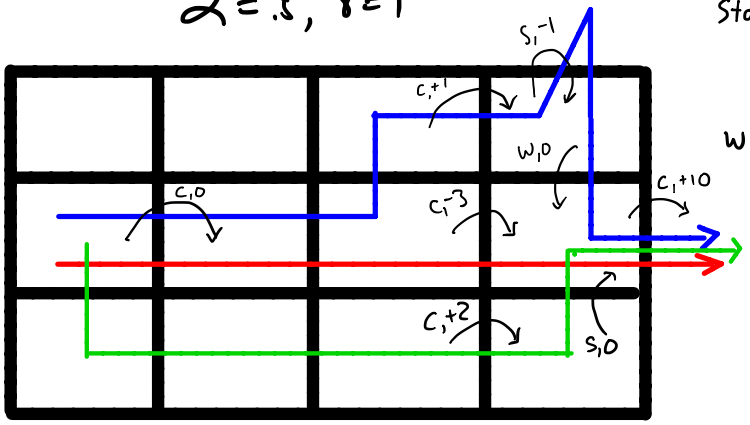
0	0	.5	-.25
0	0	1	7.5
0	0	0	0

0	0	~10.5	~9.5
~8.75	~8.75	~8.75	~10
0	0	0	0

on policy

- What about unvisited states?
- What if transition function were stochastic?
- Does the order of updates matter?

$\alpha = .5, \gamma = 1$



0	0	.5	-.25
0	0	1	7.5
0	0	0	0

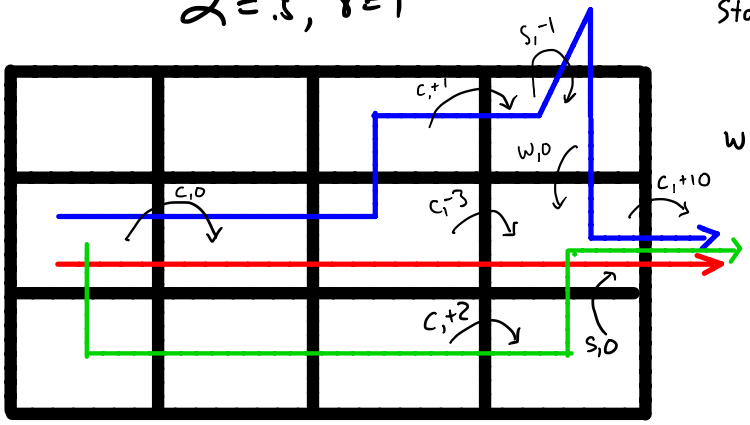
0	0	~10.5	~9.5
~8.75	~8.75	~8.75	~10
0	0	0	0

on policy

$\Delta 0$			$\Delta 0$
$\Delta 0$	$\Delta 0$	$\Delta 2$	$\Delta 10$

- What about unvisited states?
- What if transition function were stochastic?
- Does the order of updates matter?

$\alpha = .5, \gamma = 1$



0	0	.5	-.25
0	0	1	7.5
0	0	0	0

0	0	~10.5	~9.5
~8.75	~8.75	~8.75	~10
0	0	0	0

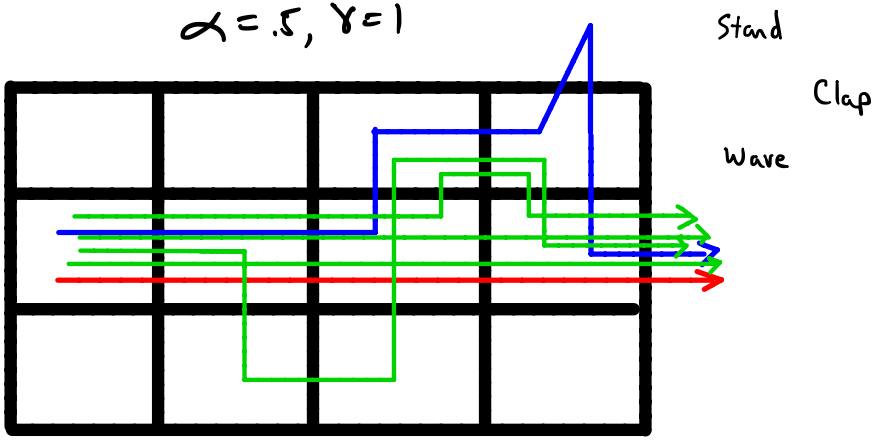
on policy

$\Delta 0$			$\Delta 0$
$\Delta 0$	$\Delta 0$	$\Delta 2$	$\Delta 10$

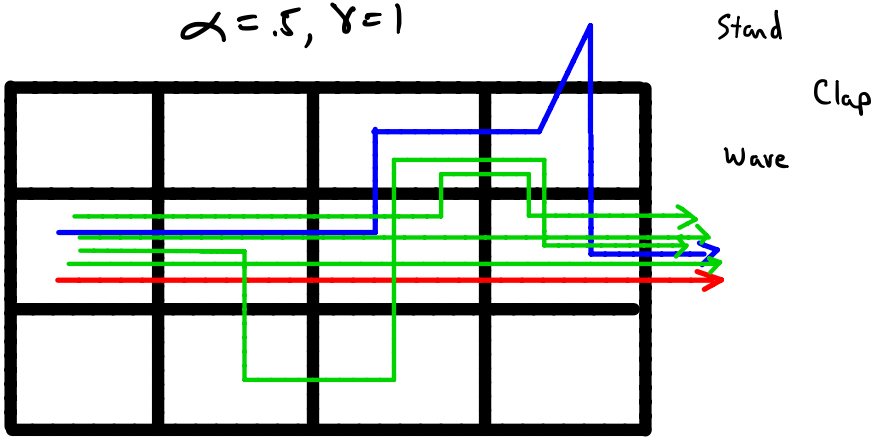
↑ then here etc.

↖ first updates

- What about unvisited states?
- What if transition function were stochastic?
- Does the order of updates matter?
  - prioritized sweeping
  - could actually do update in step (e)



Trajectory sampling: how diffrs from Dyna here?

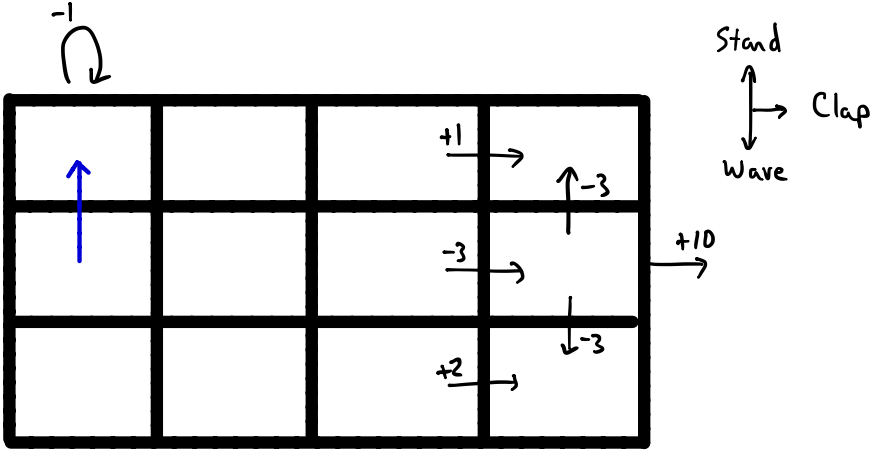


Trajectory sampling: how differs from Dyna here?

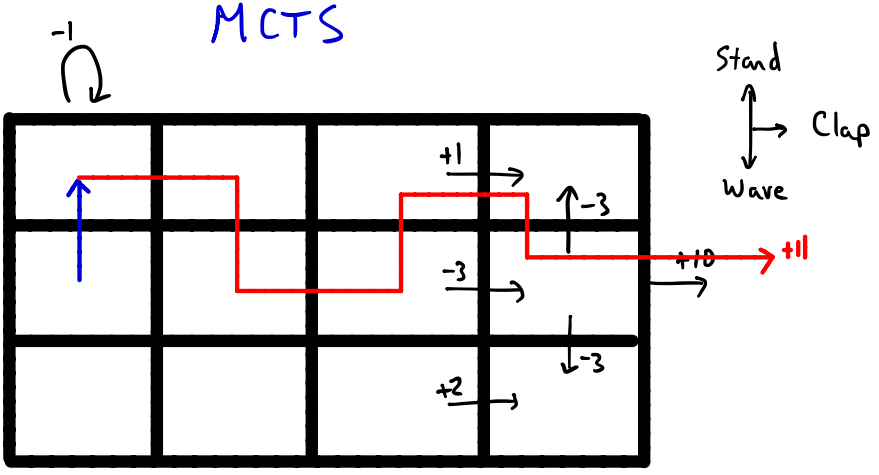
How does Dyna-Q+ differ from Dyna here?

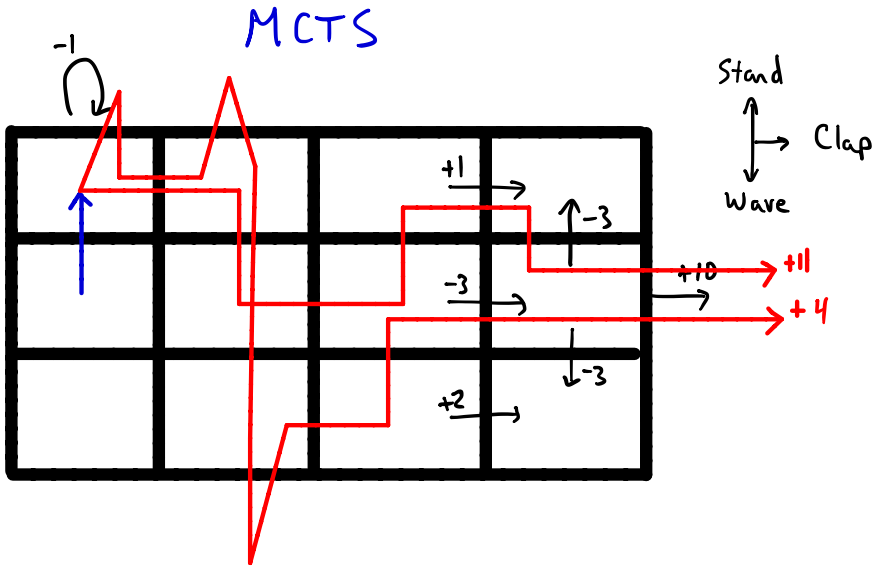
- relationship to UCB?
- In what way does Dyna-Q+ violate the authors' principles?
- Could you accomplish something similar w/out changing updates? (see ex. 8.4)

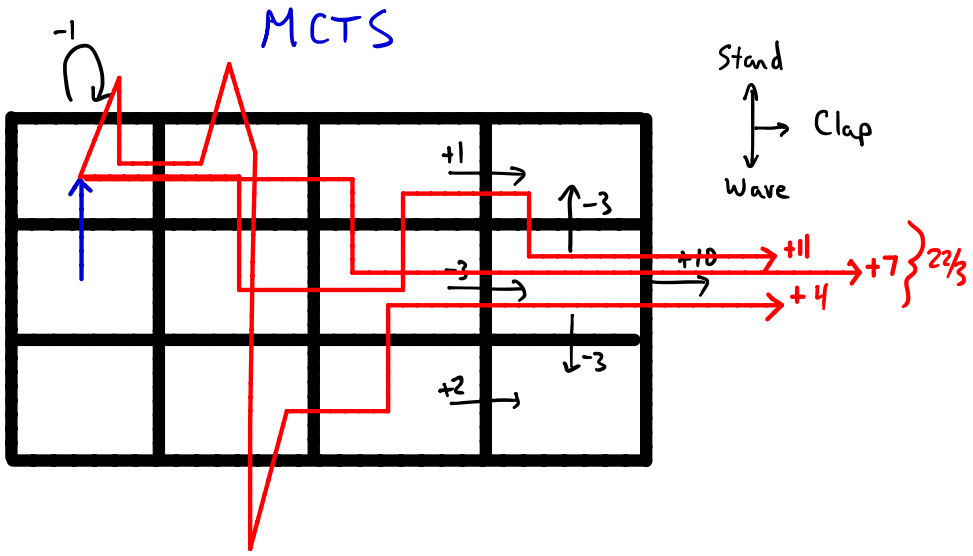
MCTS: Monte Carlo Tree Search - Planning at decision time

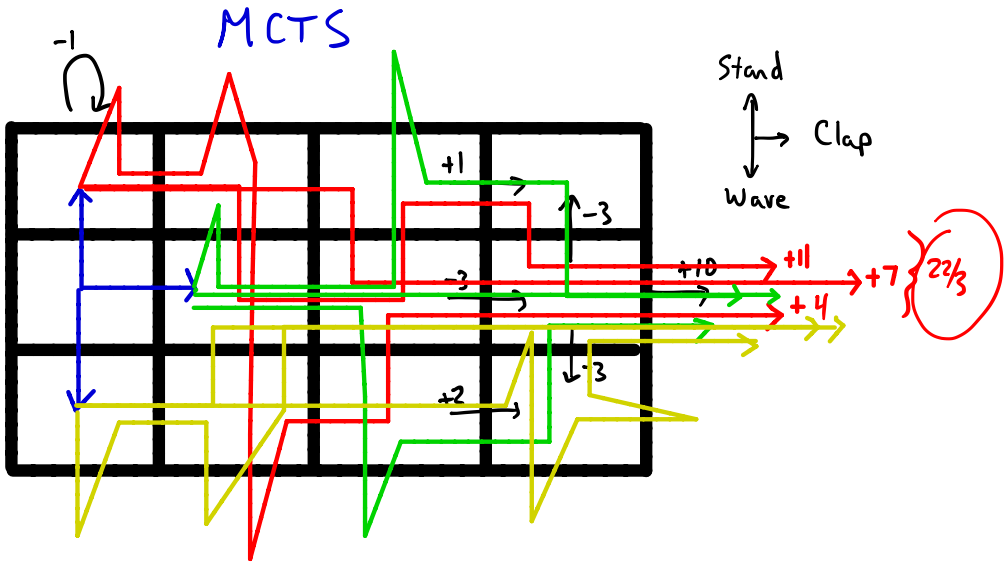


MCTS

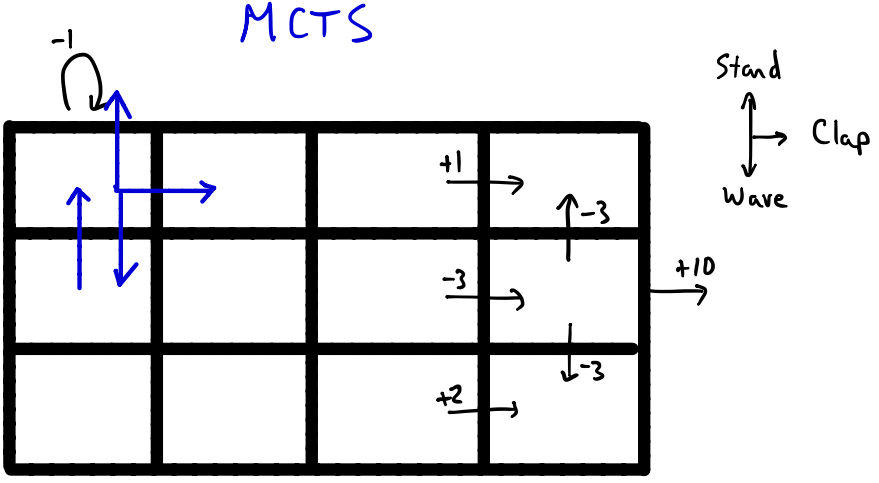


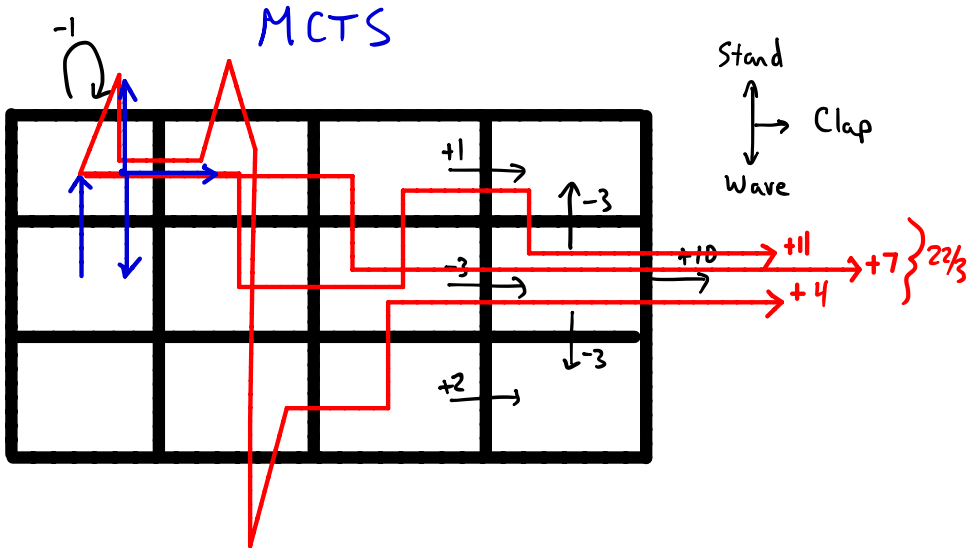

MCTS
-1
+1
-3
-3
+10
+11
+4
-3
+2
Stand
Clap
Wave

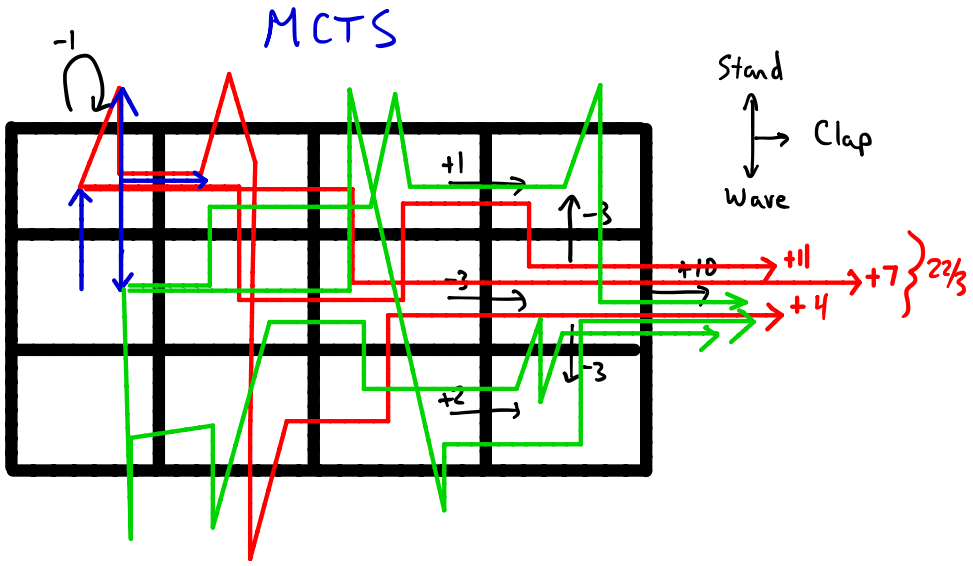

MCTS
-1
+1
-3
-3
+10
+11
+7
22/3
+4
-3
+2
Stand
Clap
Wave


MCTS
-1
+1
-3
-3
+10
+11
+7
22/3
+4
-3
+2
Stand
Clap
Wave

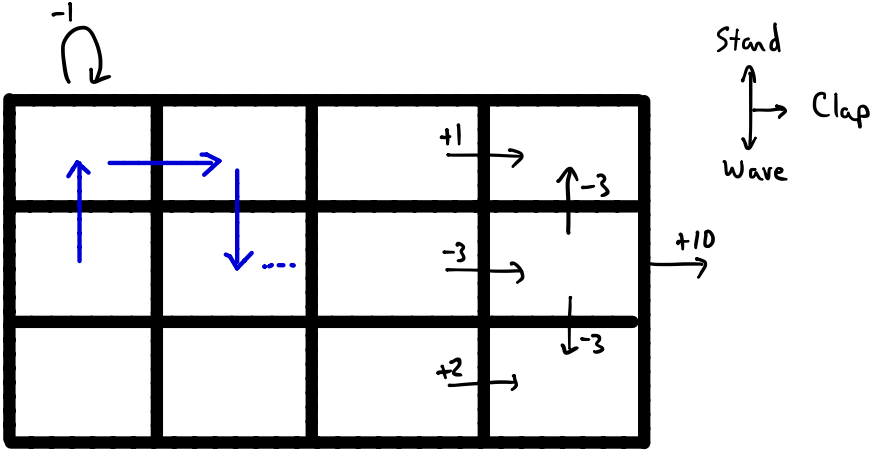
MCTS




MCTS
-1
+1
-3
-3
+10
+11
+7
22/3
+4
-3
+2
Stand
Clap
Wave

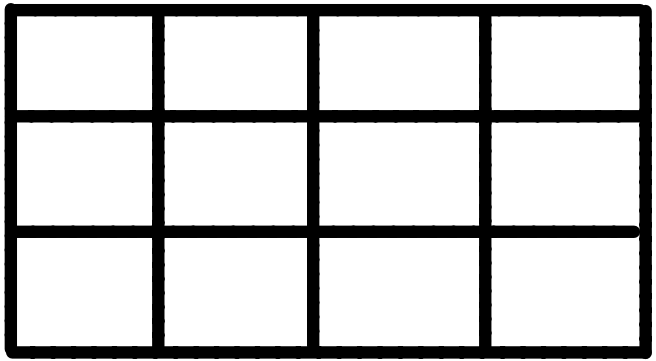

MCTS
-1
+1
-3
-3
+2
-3
+10
+11
+7
22/3
+4
Stand
Clap
Wave

MCTS: Monte Carlo Tree Search - Planning at decision time



- Interleaving planning and acting: model known
- Focusses search on current state
- Can combine w/ learning a model
- Can combine w/ a learned value function
- Random rollouts especially useful in game playing
- Can use more informed rollouts

Approximation

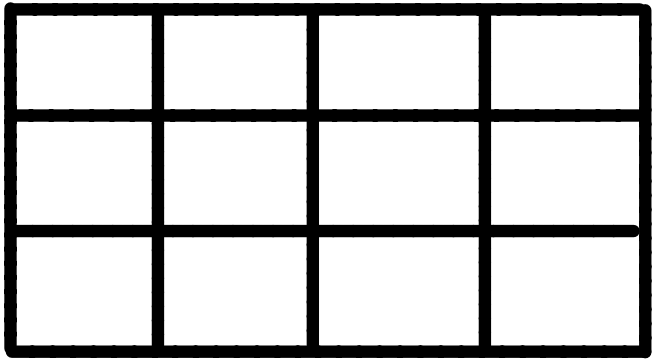


Stand

Clap

Wave

Approximation

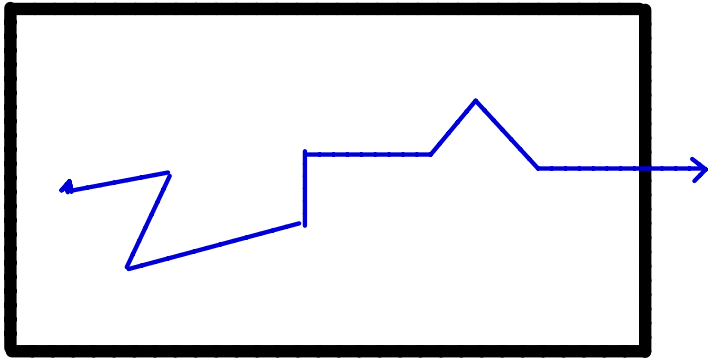


Stand

Clap

Wave

Stand



Clap

Wave