Conceptual View of Q-Learning

- Q-Learning is a form of Reinforcement Learning.
- It uses a random exploration paired with delayed reward to generate values for a "Q table".
- For some examples - the Q table is used to select the best action to move to a goal state given the agent is in a particular state

$$S(i) + a(j) \rightarrow S(k)$$

$$\text{state}(i) + \text{action}(j) \rightarrow \text{State}(k)$$

state(i): usually - in Q learning there are a finite number of states an agent can be in

action(j): there are some # of actions available to the agent. Basic systems would have all actions for each state

results in

State(k): new state as a result of action(j)

(1)

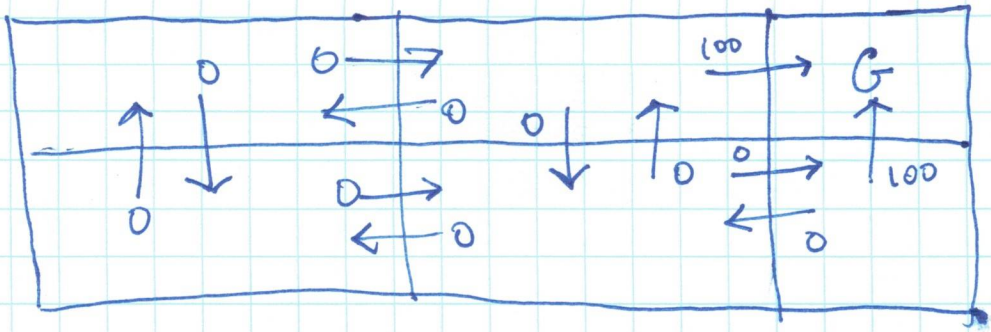


table shows immediate reward

- Only moving to the goal state provides a reward – that is an immediate reward.
- Every where else no immediate reward is given.

> A key part of Q learning is explonation of the state space.

- Agent is placed at a random state, and a random action is taken

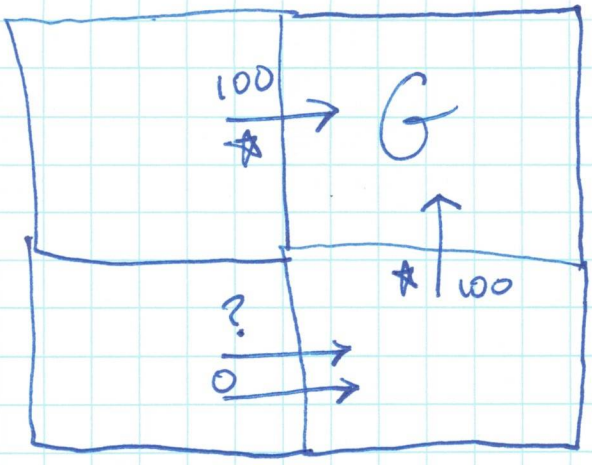
> it is the explonation that fills out the state table.

filling out the table relies on the concept of delayed reward

delay factor

$$\text{delayed reward} = \text{immediate reward at state} + \eta * \text{reward of immediate successor state}$$

↑ current



G - goal state

☆ - immediate reward for moving to the goal state

? - here we need to assign reward based on delay

? delay

0 immediate

let $\eta = .9$

delayed reward = immediate reward + η * reward of immediate successor state

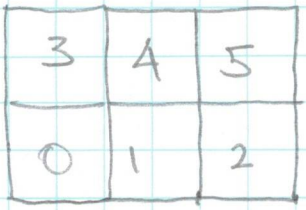
$90 = 0 + .9 * 100$

most reward available from this state (you have to pick the correct action to get it)

③ Basic Q Algorithm

```
for (j=0; j<nEpochs; j++) {
    myState = selectRandomState
    while (myState != goalState) {
        myAction = selectRandomAction
        nextState = qMatrix adj [myState][myAction]
        immediate reward = nextState].immediate_reward
        delayed reward = immediate reward + η * max (all rewards from successor states)
        qTable
        stateTable [myState][myAction].delayedReward = delayedReward
        myState = nextState
    }
}
```

④



left, right, up, down

```
qAdj = [ [-1, 1, 3, -1],
         [ 0, 2, 4, -1],
         [ 1, -1, 5, -1],
         [-1, 4, -1, 0],
         [ 3, 5, -1, 1]
         [ 4, -1, -1, 2]]
```

qAdj [nStates] [nActions]

nStates = 6

nActions = 4

```
qReward = [ [-1, 0, 0, -1],
            [ 0, 0, 0, -1],
            [ 0, -1, 0, -1],
            [-1, 0, -1, 0],
            [ 0, 0, -1, 0]
            [ 0, -1, -1, 0]]
```

qReward [nStates] [nActions]

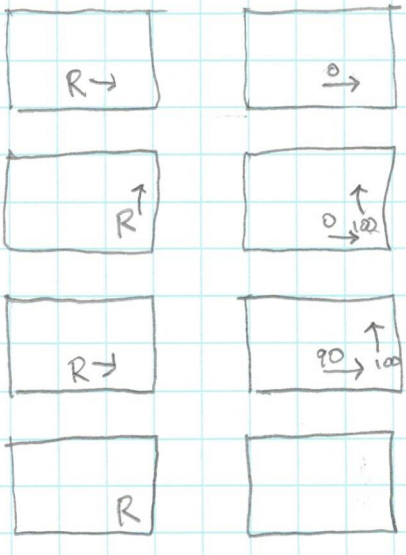
```
qImmediate [nStates] =
    [0, 0, 0, 0, 0, 0]
```

```
goal = 5                          lastState = nStates - 1     epochs = 0
qImmediate [goal] = 100           lastAction = nActions - 1
exploring = true                  γ = .9
while (exploring) {
    myState = random (0, lastState)
    while (myState != goal) {
        /* Get a valid random action. */
        myAction = random (0, lastAction)
        while ( qAdj [myState] [myAction] != -1) {
            myAction = random (0, lastAction)
        }
        nextState = qAdj [myState] [myAction]
```

(5)

```
immediateReward = qImmediate[nextState]
delayedReward = max(qReward[nextState]) * K
totalReward = immediateReward + delayedReward
qReward[myState][myAction] = totalReward
myState = nextState
}

epochs ++
if (epochs == maxEpochs) {
    exploring = false
}
}
```



Basic Q Algorithm

qImmediate is array that holds immediate reward given when agent moves to that state from an adjacent state

qMatrix is an array that holds the adjacent states given an action

qTable holds the cummulitive rewards of recieved when moving from one state to another

```
for (j=0; j< nEpochs; j++) {
    myState = selectRandomState();

    While (myState != goalState) {
        myAction = selectRandomAction();
        nextState = qMatrix[myState][myAction];
        immediateReward = qImmediate[nextState];

        delayedReward = max(qTable[nextState]
                        * decay
```

```
totalReward = immediateReward +
                  delayedReward
qTable[myState][myAction] =
                  totalReward

myState = nextstate
} /* end while */

} /* end for */
```