

Implementation: MC Prediction (State Values)

The pseudocode for (first-visit) MC prediction (for the state values) can be found below. (Feel free to implement either the first-visit or every-visit MC method. In the game of Blackjack, both the first-visit and every-visit methods return identical results.)

First-Visit MC Prediction (for State Values)

```
Input: policy \pi, positive integer num\_episodes
Output: value function V (\approx v_{\pi} if num\_episodes is large enough)
Initialize N(s) = 0 for all s \in \mathcal{S}
Initialize returns\_sum(s) = 0 for all s \in \mathcal{S}
for i \leftarrow 1 to num\_episodes do

Generate an episode S_0, A_0, R_1, \ldots, S_T using \pi
for t \leftarrow 0 to T-1 do

if S_t is a first visit (with return G_t) then

N(S_t) \leftarrow N(S_t) + 1
returns\_sum(S_t) \leftarrow returns\_sum(S_t) + G_t
end
end
V(s) \leftarrow returns\_sum(s)/N(s) for all s \in \mathcal{S}
return V
```

If you are interested in learning more about the difference between first-visit and every-visit MC methods, you are encouraged to read Section 3 of **this paper**. Their results are summarized in Section 3.6. The authors show:

- Every-visit MC is biased, whereas first-visit MC is unbiased (see Theorems 6 and 7).
- Initially, every-visit MC has lower mean squared error (MSE), but as more episodes are collected, first-visit MC attains better MSE (see Corollary 9a and 10a, and Figure 4).

Both the first-visit and every-visit method are **guaranteed to converge** to the true value