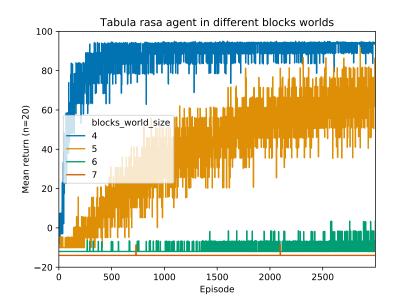
To reproduce the results from the bachelor's thesis

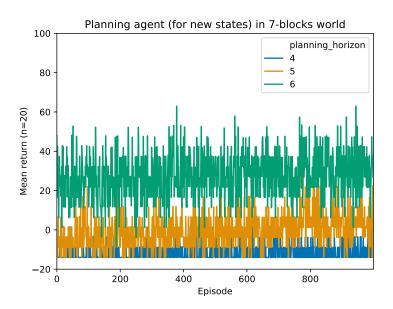
## Experiment 1a



# Experiment 1a

- Results are as expected.
- ▶ Bigger blocks worlds need much more episodes to train.

# Experiment 1b

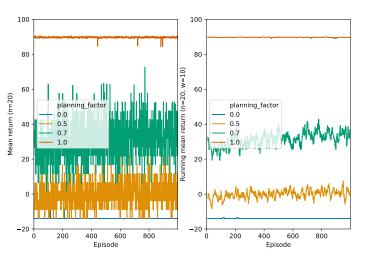


## Experiment 1b

- Adding a planning component clearly speeds up training.
- ► Already small planning horizons cause significant increase in training speed (compared to the previous experiment).
- Bigger planning horizons speed up training even more.

### Experiment 1c

Planning agent (at random times, ph=12) in 7-blocks world



The original output (left) is too messy. Used running average to smooth the result and make it more readable (right).

### Experiment 1c

- Planning at random times speeds up training as well.
- However, even with near-perfect planning horizons, planning at random times is not as effective as planning for new states.
  - ... except when planning\_factor=1.0, i.e. when the planner is used at every timestep - too expensive!

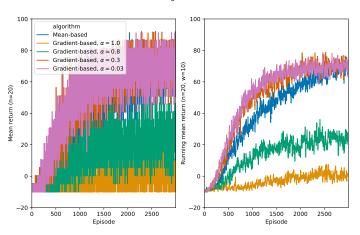
#### Conclusion

- ▶ Overall, the results seem to be in line with that of the bachelor's thesis.
- ▶ Planning clearly improves the training process.

To compare the mean-based First-visit Monte-Carlo method from the bachelor's thesis with a gradient-based every-visit monte-carlo method.

# Experiment 2a

Tabula rasa agent in 5-blocks world



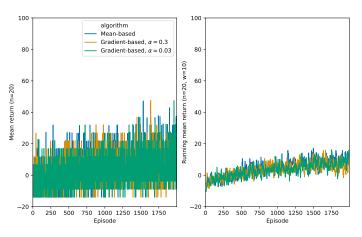
The original output (left) is too messy. Used running average to smooth the result and make it more readable (right).

## Experiment 2a

- ► There is no clear difference between the mean-based and the gradient-based algorithm at its best.
  - It may look like the gradient-based algorithm is better, but this is just a coincidence. Re-running the experiment may cause the mean-based algorithm to perform better.
  - Note Probably a good idea to re-run this experiment with a higher sample size.
- ▶ Both  $\alpha = 0.3$  and  $\alpha = 0.03$  seem to be good parameter choices.
- ▶ There seems to be a decrease in performance for higher values ( $\alpha \ge 0.8$ ), which is expected.

### Experiment 2b

Planning agent (for new states, ph=5) in 7-blocks world



The original output (left) is too messy. Used running average to smooth the result and make it more readable (right).

# Experiment 2b

- Planning still speeds up training, also for the gradient-based algorithm.
- ► There is no clear difference between the mean-based and gradient-based algorithms.

#### Conclusions

- Overall, the gradient-based method seems to work as well as the mean-based method.
- ► The gradient-based method handles planning as well as the mean-based method.

This experiment is for profiling the framework and identifying possible bottlenecks.

### Experiment 3a

Fri Sep 4 12:14:58 2020

### Tabula-rasa agent in a 7-blocks world, 150 episodes exp3a\_profile\_raw.txt

```
1164209 function calls (1156493 primitive calls) in 6.990 seconds
   Ordered by: internal time
   List reduced from 2708 to 20 due to restriction <20>
   ncalls
          tottime percall
                            cumtime
                                     percall filename: lineno(function)
     2251
            2 993
                     0.001
                              2 993
                                       0.001 {method 'ground' of 'clingo.Control' objects}
    4501
          1.252
                     0.000
                              1.252
                                       0.000 {method 'load' of 'clingo.Control' objects}
    8852
            0.536
                              0.536
                                       0.000 {method 'add' of 'clingo.Control' objects}
                     0.000
      150
            0.324
                     0.002
                              5.735
                                       0.038 MonteCarlo.pv:49(generate episode)
                                       0.002 markov_decision_procedure.py:31(transition)
    2100
            0.323
                     0.000
                              5.007
            0.301
                              0.301
                                       0.000 blocksworld.py:88(<genexpr>)
   301064
                     0.000
            0.199
                     0.199
                              0.644
                                       0.644 blocksworld.py:88(<listcomp>)
       1
    39883
            0.162
                     0.000
                              0.162
                                       0.000 {method 'symbols' of 'clingo.Model' objects}
    2251
            0.070
                     0.000
                              0.070
                                       0.000 {method 'solve' of 'clingo.Control' objects}
                              0.071
                                       0.001 {built-in method imp.create dynamic}
    51/50
            0.069
                     0.001
      257
            0.051
                     0.000
                              0.051
                                       0.000 {built-in method marshal.loads}
            0.039
                     0.039
                              0.039
                                       0.039 {built-in method mkl._pv_mkl_service.get_version}
       1
     257
            0.038
                     0.000
                              0.044
                                       0.000 <frozen importlib. bootstrap_external>:914(get_data)
    1391
            0.032
                     0.000
                              0.032
                                       0.000 {built-in method posix.stat}
    4530
            0.025
                     0.000
                              0.039
                                       0.000 posixpath.py:338(normpath)
    2467
            0.023
                     0.000
                              0.039
                                       0.000 inspect.py:613(cleandoc)
                                       0.002 markov decision procedure.pv:13( init )
      150
            0.022
                     0.000
                              0.360
                                       0.002 markov_decision_procedure.py:91(_compute_available_actions)
      150
            0.020
                     0.000
                              0.338
            0.015
                     0.000
                              0.059
                                       0.000 {built-in method builtins. build class }
 1061/970
16318/16314
              0.014
                       0.000
                                0.025
                                         0.000 {method 'ioin' of 'str' objects}
```

### Experiment 3b

Fri Sep 4 12:15:22 2020

Planning agent (for new states, ph=5) in a 7-blocks world, 150 episodes

exp3b\_profile\_raw.txt

```
1332591 function calls (1324875 primitive calls) in 22.789 seconds
   Ordered by: internal time
   List reduced from 2712 to 20 due to restriction <20>
                            cumtime percall filename: lineno(function)
   ncalls tottime percall
    3532
          11.088
                     0.003
                             11.088
                                       0.003 {method 'ground' of 'clingo.Control' objects}
     3532
          3 833
                     0.001
                              3.833
                                       0.001 {method 'solve' of 'clingo.Control' objects}
    8422 2.027
                     0.000
                              2.027
                                       0.000 {method 'load' of 'clingo.Control' objects}
                                       0.011 planner.pv:17(suggest next action)
    1359 1.871
                     0.001
                             15.146
                                       0.144 MonteCarlo.pv:49(generate episode)
      150
           1.308
                     0.009
                             21.602
    13976
            0.818
                     0.000
                              0.818
                                       0.000 {method 'add' of 'clingo.Control' objects}
                              4.764
                                       0.002 markov decision procedure.pv:31(transition)
    2022
            0.335
                     0.000
   301064
            0.292
                     0.000
                              0.292
                                       0.000 blocksworld.py:88(<genexpr>)
            0.209
                     0.209
                              0.647
                                       0.647 blocksworld.py:88(<listcomp>)
       1
    41164
            0.175
                     0.000
                              0.175
                                       0.000 {method 'symbols' of 'clingo.Model' objects}
                              0.048
      257
            0.048
                     0.000
                                       0.000 {built-in method marshal.loads}
            0.041
                     0.000
                              0.062
                                       0.000 posixpath.py:338(normpath)
    7093
    51/50
            0.040
                     0.001
                              0.042
                                       0.001 {built-in method imp.create_dynamic}
                                       0.039 {built-in method mkl. pv mkl service.get version}
       1
            0.039
                     0.039
                              0.039
     2467
            0.022
                     0.000
                              0.038
                                       0.000 inspect.py:613(cleandoc)
21443/21439
              0.021
                       0.000
                                0.037
                                         0.000 {method 'join' of 'str' objects}
      150
            0.021
                     0.000
                              0.321
                                       0.002 markov decision procedure.pv:91( compute available actions)
      150
            0.020
                     0.000
                              0.342
                                       0.002 markov decision procedure.pv:13( init )
    7202
            0.019
                     0.000
                              0.026
                                       0.000 posixpath.py:75(join)
    1391
            0.019
                     0.000
                              0.019
                                       0.000 {built-in method posix.stat}
```

#### **Observations**

- Let's compare these results to the last implementation:
  - ► The tabular rasa agents runtime decreased from 17.9s to 7.0s (-60%)
  - ► The planning agent runtime decreased from 34.5s to 22.7s (-34%)
- ► The tabula-rasa agent spent ~5s in transition to next states and ~1s iterating all 7-blocks world states.
- ► The planning agent spent ~5s in transition, ~1s iterating all states and ~15s planning.