

# Reproducing the concept of ordered landmarks in planning

## The effect of ordered landmarks on plan length in forward search

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### Introduction

#### Planning problem

- Generate an action sequence from the initial state to the goal state
- Minimize the sequence length
- The problem is PSPACE-hard

#### Forward search

- A type of planning algorithm
- Models the planning problem as a graph, then uses A\* to find a plan
- The difference between planners of this type is the heuristic used in A\*

#### Landmark

Proposition in the state space that is true at some point in every valid solution

#### Landmark order

For landmarks A and B:

$A \leq B$  holds **iff** when  $B \wedge \neg A$  holds,  $\neg B$  must hold at some point before  $A \wedge B$  can hold



**Figure 2:** Example problem from *Blocksworld*  
Source: [1, Fig. 1]

### Research Question

*How do ordered landmarks affect the solution length of forward search planning in the SymbolicPlanners framework?*

1. Reproduce previous work using SymbolicPlanners
2. Draw conclusion about solution length using landmarks

### Methodology

#### Reproduce

- The results in previous work from Porteous et al. [1] are reproduced
- Possible biases are reduced by implementing all planners in the SymbolicPlanners framework

#### Implement

- The idea of ordered landmarks is implemented
- The Julia language is used for the implementation

#### Benchmark

- Find PDDL descriptions of the problem instances used for previous experiments  
PDDL: a format to describe planning problems
- We compare to the forward search planner *Fast-Forward*
- Both our planner using ordered landmarks and a *Fast-Forward* planner from SymbolicPlanners was run on the obtained instances

#### Compare

- The ratio between the solution length of *Fast-Forward* and the landmark implementation is calculated
- The calculated ratios are compared against the ratios in previous work

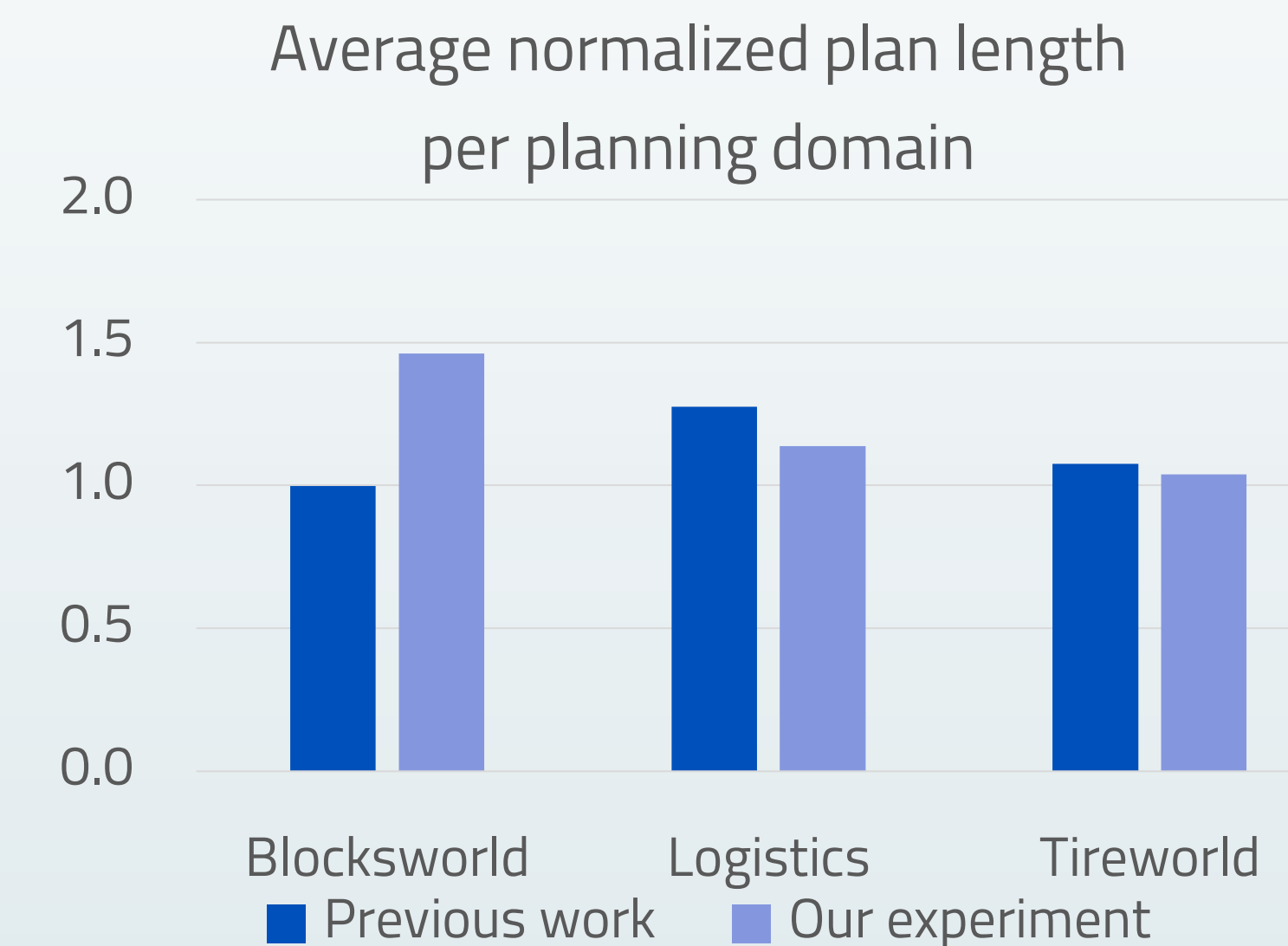
### Results

#### Compared to previous work

- Not exact the same solution lengths
- Mean and standard deviation comparable

#### Relative solution lengths in our experiment

- With landmarks 22% longer plans than without
- Notable difference in *Blocksworld*



```
foreach f ∈ I do
  enqueue(Q, f);
end
while ¬empty(Q) do
  n ← dequeue(Q);
  foreach p ∈ prerequisites_in_graph(n, P) do
    if ¬reach_without_prop(p, G) then
      enqueue(Q, p);
      insert(N, p);
      insert(E, (p, n));
    end
  end
end
foreach n1 ∈ N do
  if true_in_state(n1, G) then
    foreach n2 ∈ N do
      if interferes(n1, n2) then
        insert(E, (n1, n2));
      end
    end
  else
    foreach n2 ∈ interesting_nodes(n1) do
      if interferes(n1, n2) then
        insert(E, (n1, n2));
      end
    end
  end
end
```

**Figure 3:** Ordered landmark generation

### Limitations

#### Implementation

- SymbolicPlanners is slower than implementations in previous work
- Design choices in previous work are not well documented

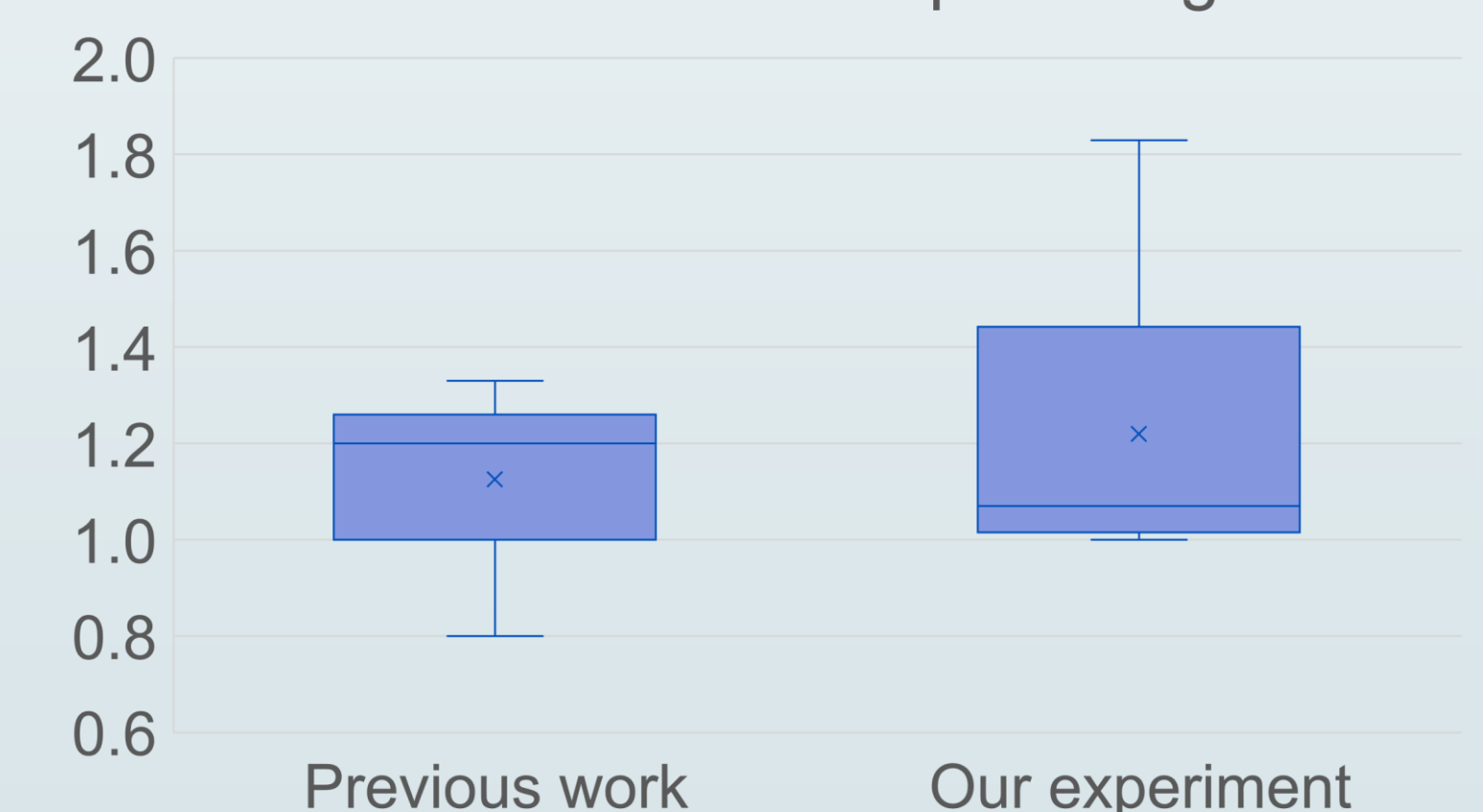
#### Experiment

- Only one previous experiment verified
- Less than half of the tested problems finished
- Some tested domains are left out due to a lack of results

### Conclusion

*A planner which uses landmarks generates on average 22% longer plans than a planner which does not use landmarks*

#### Distribution of relative plan lengths

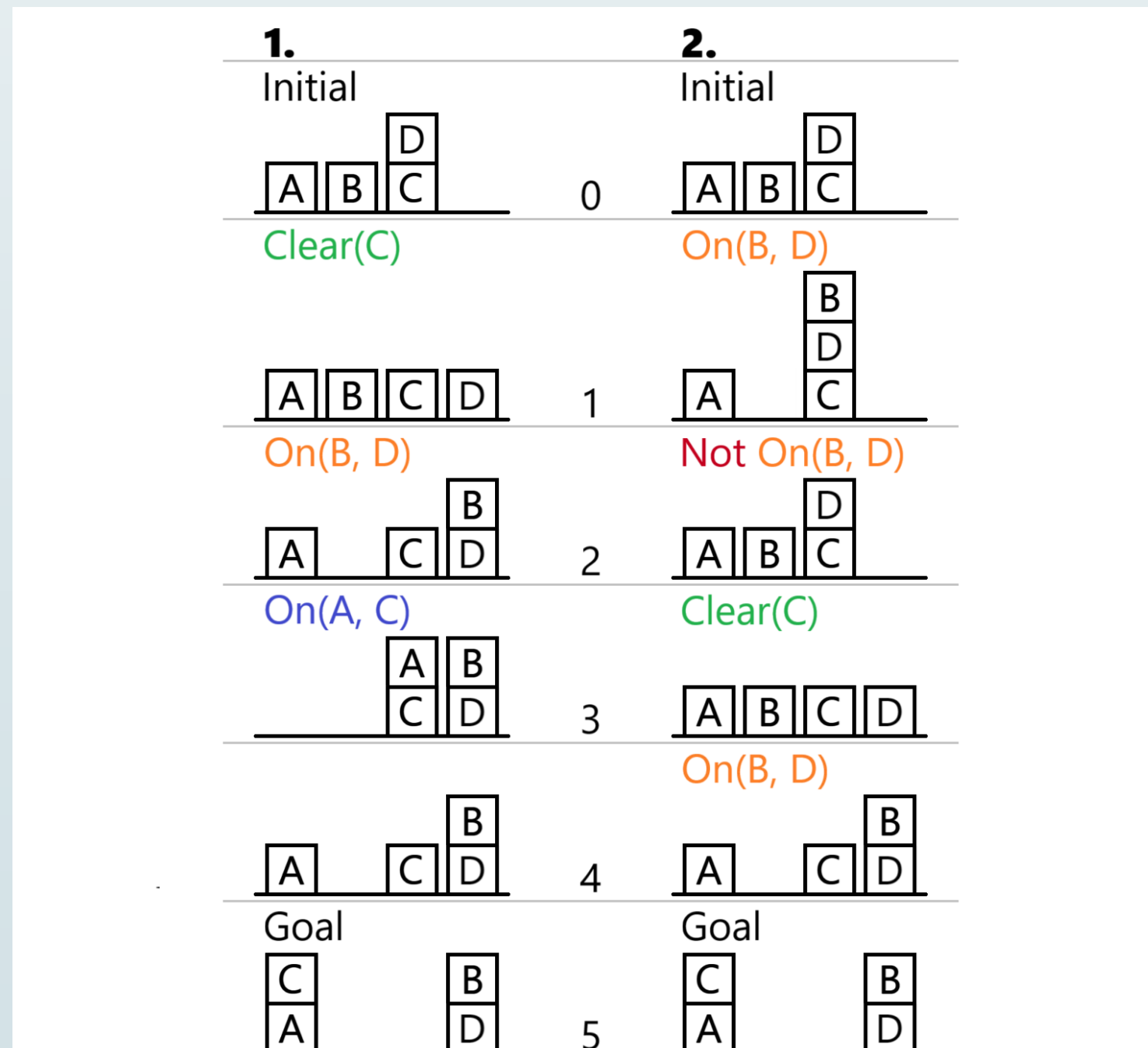


### Acknowledgements and References

Poster template:

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- [1] J. Porteous, L. Sebastia, and J. Hoffmann. *On the extraction, ordering, and usage of landmarks in planning*. In ECP-01. Sixth European Conference on Planning, Toledo, Spain, pages 37–48, 2001.



**Figure 1:** The states in two valid plans for the problem in Figure 2. Proposition *On(A, C)* is not a landmark. Landmark *Clear(C)* is reasonably ordered before landmark *On(B, D)*.