A Additional Analysis of CS-PIBT

A.1 **Ouantitative Analysis**

- Converting the probability distribution to an action ordering 725 using sampling was substantially better than using a strict ordering of probabilities. One possibly hypothesis is that the distributions induced are different as the strict ordering could over-prefer higher probability actions. Figure A1 vi-
- sualizes the action distribution when converting probabili-730 ties into action orders using strict ordering and sampling. We notice they are very similar, indicating this is not the cause of the performance difference within CS-PIBT. This specific distribution is for 50 agents not at their goal location. Note
- agents at their goal had different overall distributions (i.e. 735 "stop" probabilities were 1st nearly all the time), but strict and sampled ordering produced similar representative distributions there too.

Action Ordering Distribution using Strict Ordering



(a) The value of cell [action, k] is the probability that action is the k^{th} preference when converting probability distributions to action orderings using strict ordering.

Action Ordering Distribution using Sampled Ordering



(b) The value of cell [action, k] is the probability that action is the k^{th} preference when converting probability distributions to action ordering using sampled ordering.

Figure A1: Action ordering distributions

A.2 **Qualitative Analysis**

We provide https://shorturl.at/mtuF0 with visualization ani-740 mations of MAGAT with CS-Naive, CS-PIBT strict ordering (without randomness), and CS-PIBT with sampling. Obstacles are black and free space is white. Each agent is given a unique color, with their corresponding goal location visualized in a slightly darker color. When an agent reaches its 745 goal location it turns grey. Note that since goals are visualized similarly to agents, there may be moments it looks like one agent is passing over/through another agent. This is not the case, those agents are passing over/through another agent's goal location. The goal coloring is useful near 750 the end of animations of failures cases as it highlights how agents get stuck due to other agents resting near their goal location.

We observe most failure cases occur due to a few agents getting stuck in deadlock or live-lock near their goal due to other agents resting at their nearby goal locations. Failure cases with CS-PIBT with strict ordering show live-lock where agents alternate between the same positions, while CS-PIBT with sampling does not show it as often. Thus, sampling is effective in reducing these instances by promot-760 ing trying different actions at the same location. We also note that with CS-Naive, agents in crowds take quite long (or possibly never) to leave/travel through the crowd, while with CS-PIBT they are able to travel effectively through them.

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