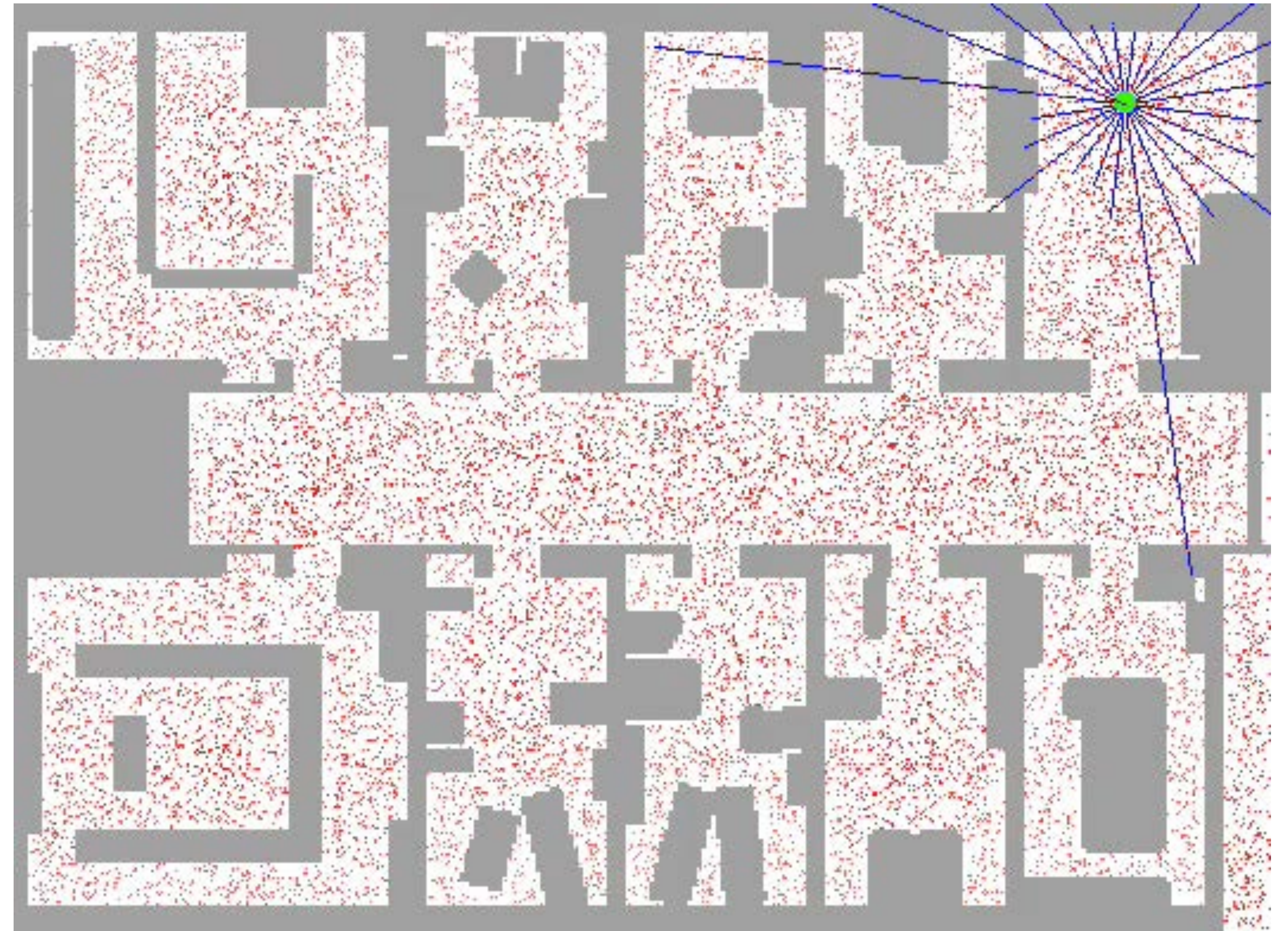


Lecture 20

Mobile Robotics - V -

Localization



Course logistics

- Project 6 was posted on 03/20 and is due **04/01 (extended)**

- Quiz 10 will be posted tomorrow noon and will be due on 04/02

- Project 7:

- Groups are formed.
- Two parts (~1 hr each) - Instructions will be provided
 - Beginner's guide.
 - Real Robot Challenge.

Location: Shepherd Labs 164 (Drone Lab) - this place will not be available for experiments after the dedicated times shown below.
 Note: Talk to your team members and find a slot that works best to do P7 experiments. You will need two sessions as a team to perform the tasks we created for you. Please do not overbook. Start with 2 1-hour sessions.
 You will need to come in as a team to finish these tasks.
 Course staff will be present to guide you through the process.
 Your Group Numbers are available in the next Sheet.

03/28/2024			04/01/2024			04/03/2024			04/04/2024		
Robot-0	2:30-3:30 pm	Group-4	Robot-0	2:30-3:30 pm	Group-4	Robot-0	2:30-3:30 pm	Group-4	Robot-0	2:00-3:00 pm	Group-9
Robot-1	2:30-3:30 pm	Group-2	Robot-1	2:30-3:30 pm	Group-2	Robot-1	2:30-3:30 pm	Group-2	Robot-1	2:00-3:00 pm	Available
Robot-2	2:30-3:30 pm	Group-5	Robot-2	2:30-3:30 pm	Group-5	Robot-2	2:30-3:30 pm	Group-6	Robot-2	2:00-3:00 pm	Available
Robot-3	2:30-3:30 pm	Group-10	Robot-3	2:30-3:30 pm	Group-10	Robot-3	2:30-3:30 pm	Group-11	Robot-3	2:00-3:00 pm	Available
Robot-4	2:30-3:30 pm	Group-1	Robot-4	2:30-3:30 pm	Group-1	Robot-4	2:30-3:30 pm	Group-13	Robot-4	2:00-3:00 pm	Group-1
Robot-0	3:30-4:30 pm	Group-5	Robot-0	3:30-4:30 pm	Group-5	Robot-0	3:30-4:30 pm	Group-10	Robot-0	3:00-4:00 pm	Available
Robot-1	3:30-4:30 pm	Available	Robot-1	3:30-4:30 pm	Available	Robot-1	3:30-4:30 pm	Group-12	Robot-1	3:00-4:00 pm	Group-8
Robot-2	3:30-4:30 pm	Available	Robot-2	3:30-4:30 pm	Available	Robot-2	3:30-4:30 pm	Group-6	Robot-2	3:00-4:00 pm	Available
Robot-3	3:30-4:30 pm	Available	Robot-3	3:30-4:30 pm	Available	Robot-3	3:30-4:30 pm	Available	Robot-3	3:00-4:00 pm	Available
Robot-4	3:30-4:30 pm	Available	Robot-4	3:30-4:30 pm	Available	Robot-4	3:30-4:30 pm	Group-7	Robot-4	3:00-4:00 pm	Available
04/08/2024			04/09/2024			04/11/2024			04/15/2024		
Robot-0	2:30-3:30 pm	Available	Robot-0	2:00-3:00 pm	Available	Robot-0	2:00-3:00 pm	Available	Robot-0	2:30-3:30 pm	Available
Robot-1	2:30-3:30 pm	Available	Robot-1	2:00-3:00 pm	Available	Robot-1	2:00-3:00 pm	Available	Robot-1	2:30-3:30 pm	Available
Robot-2	2:30-3:30 pm	Available	Robot-2	2:00-3:00 pm	Available	Robot-2	2:00-3:00 pm	Available	Robot-2	2:30-3:30 pm	Available
Robot-3	2:30-3:30 pm	Available	Robot-3	2:00-3:00 pm	Available	Robot-3	2:00-3:00 pm	Available	Robot-3	2:30-3:30 pm	Available
Robot-4	2:30-3:30 pm	Available	Robot-4	2:00-3:00 pm	Available	Robot-4	2:00-3:00 pm	Available	Robot-4	2:30-3:30 pm	Available
Robot-0	3:30-4:30 pm	Available	Robot-0	3:00-4:00 pm	Available	Robot-0	3:00-4:00 pm	Available	Robot-0	3:30-4:30 pm	Available
Robot-1	3:30-4:30 pm	Available	Robot-1	3:00-4:00 pm	Group-7	Robot-1	3:00-4:00 pm	Group-7	Robot-1	3:30-4:30 pm	Available
Robot-2	3:30-4:30 pm	Available	Robot-2	3:00-4:00 pm	Available	Robot-2	3:00-4:00 pm	Available	Robot-2	3:30-4:30 pm	Available
Robot-3	3:30-4:30 pm	Available	Robot-3	3:00-4:00 pm	Available	Robot-3	3:00-4:00 pm	Available	Robot-3	3:30-4:30 pm	Available
Robot-4	3:30-4:30 pm	Available	Robot-4	3:00-4:00 pm	Available	Robot-4	3:00-4:00 pm	Available	Robot-4	3:30-4:30 pm	Available

- Scheduler is shared with the class.
 - Please book your 2 1-hour sessions.
 - Both the parts needs to be completed by 04/15.

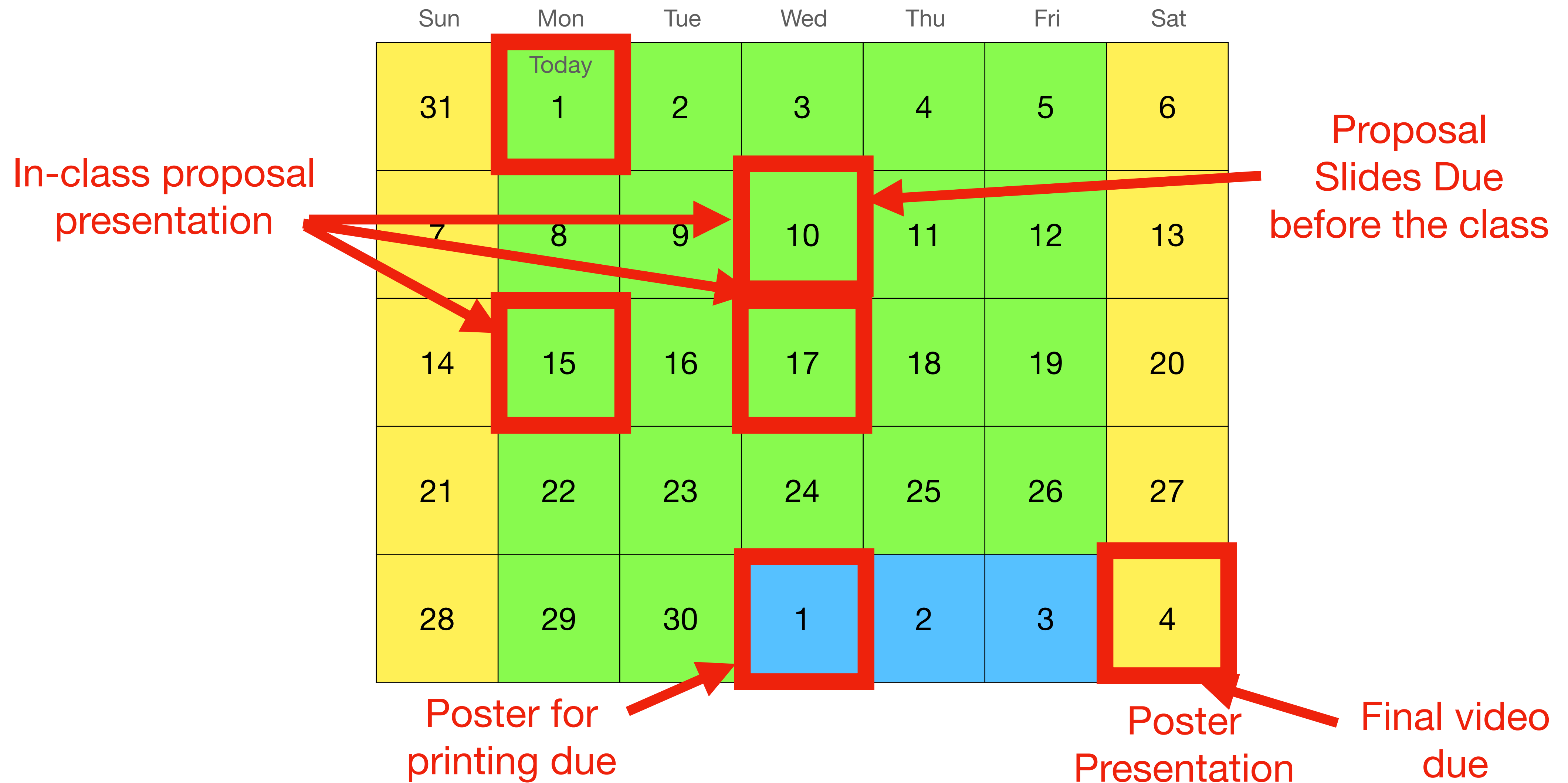
- No TA OHs between 03/28 and 04/12.

- Karthik's OH will be available to discuss final projects.
- Chahyon and Xun's OH are cancelled between 03/28 and 04/12. They maybe available upon request for the UNITE team.

- Final Poster Session: 05/04/2024 - Saturday - 1pm - 4pm, Shepherd Labs 164 - mark your calendars**



Final (Open) Project timeline



Final (Open) Project timeline

- **Proposal Slides: (template will be provided)**
 - 1-4 Slides
 - Title, Motivation, Input - Output, Evaluation, Deliverables, Timeline, Who is doing what?
 - Where does your project stand not the 3-axes (robots, objects, tasks)?
 - Backup plan
- **In-class proposal presentation (<8mins) :**
 - Teams will get feedback from the class
- **Final video:**
 - Describing the project idea and the outcome.
- **Poster presentation: (template will be provided)**
 - Presenting the project idea and the outcome to audience.

- Final Project: 15%
 - Project proposal slides + presentation: 2%
 - Final project video: 5%
 - Poster presentation (evaluation by judges): 3%



Final Project (Open ended)

Think along these axes to
decide your final project!

Evaluating your
implementation/system with
quantitative results are **VERY**
important!

Long horizon tasks

Tasks

Objects

Rearrangement of a set of objects

You may use:

- Kineval codebase
- Other sim environments (**pybullet, Gazebo, DRAKE, Isaac sim**)
- Turtlebot3 (**provided only upon compelling proposal, only 5 are available**)
- Other robots you may have access to.

Multi-robot task execution

Robots

Continuing previous Lecture

PF and localization



Particle Filter

Particle_filter($\mathcal{X}_{t-1}, u_t, z_t$):

```
1:  $\bar{\mathcal{X}}_t = \mathcal{X}_t = \emptyset$ 
2: for  $j = 1$  to  $J$  do
3:   sample  $x_t^{[j]} \sim \pi(x_t)$ 
4:    $w_t^{[j]} = \frac{p(x_t^{[j]})}{\pi(x_t^{[j]})}$ 
5:    $\bar{\mathcal{X}}_t = \bar{\mathcal{X}}_t + \langle x_t^{[j]}, w_t^{[j]} \rangle$ 
6: endfor
7: for  $j = 1$  to  $J$  do
8:   draw  $i \in 1, \dots, J$  with probability  $\propto w_t^{[i]}$ 
9:   add  $x_t^{[i]}$  to  $\mathcal{X}_t$ 
10: endfor
11: return  $\mathcal{X}_t$ 
```

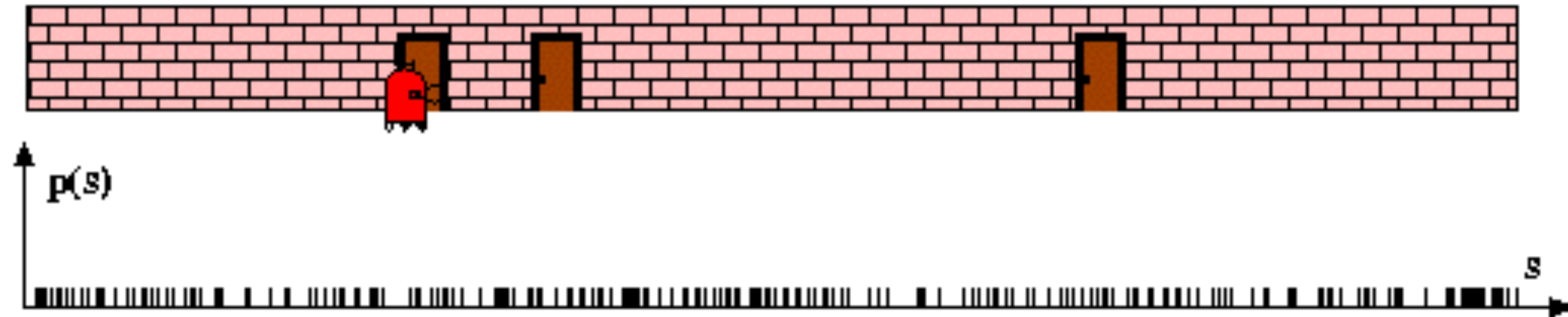
Particle Filter for Localization

Particle_filter($\mathcal{X}_{t-1}, u_t, z_t$):

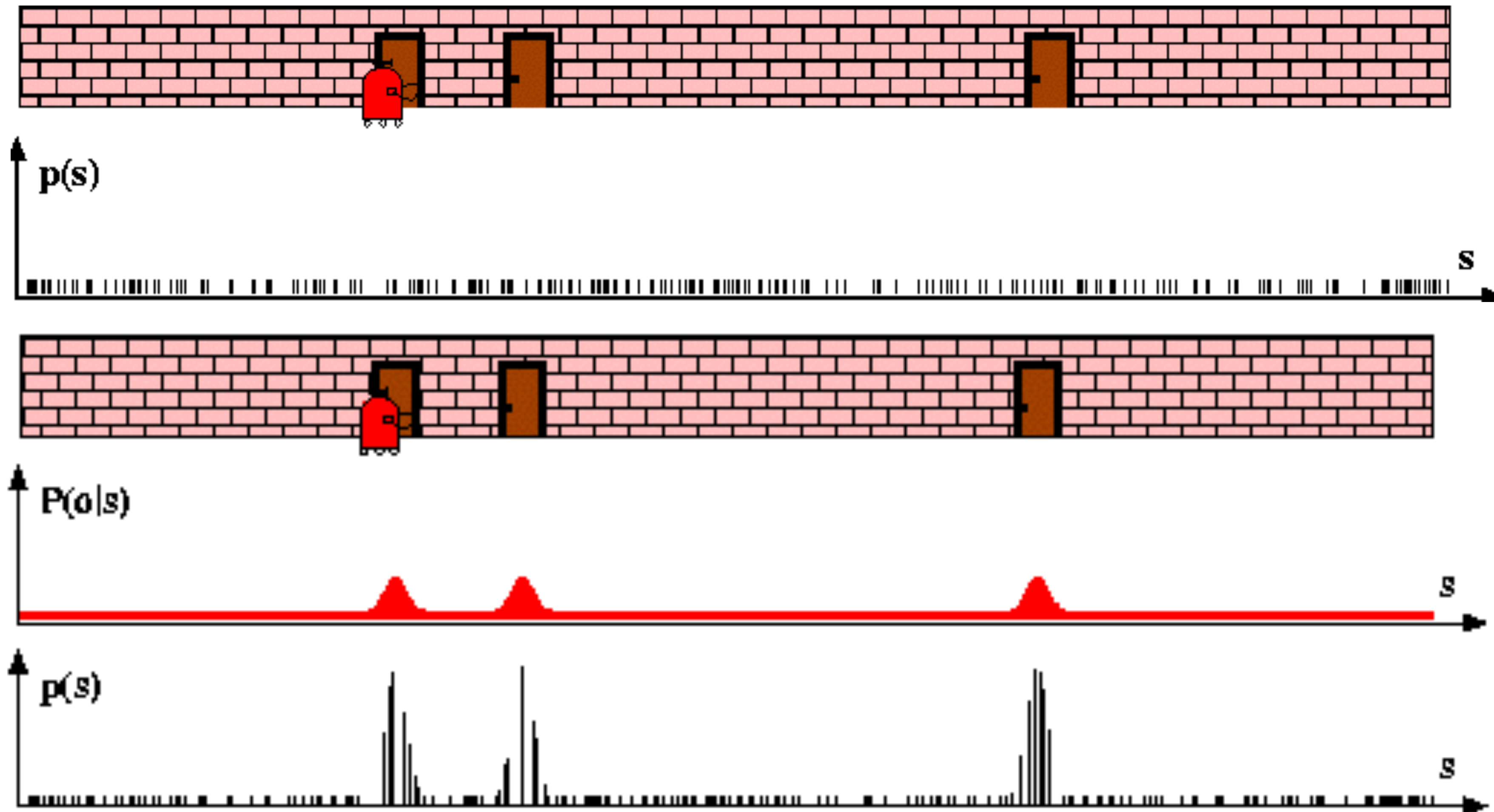
```
1:  $\bar{\mathcal{X}}_t = \mathcal{X}_t = \emptyset$ 
2: for  $j = 1$  to  $J$  do
3:   sample  $x_t^{[j]} \sim p(x_t | u_t, x_{t-1}^{[j]})$ 
4:    $w_t^{[j]} = p(z_t | x_t^{[j]})$ 
5:    $\bar{\mathcal{X}}_t = \bar{\mathcal{X}}_t + \langle x_t^{[j]}, w_t^{[j]} \rangle$ 
6: endfor
7: for  $j = 1$  to  $J$  do
8:   draw  $i \in 1, \dots, J$  with probability  $\propto w_t^{[i]}$ 
9:   add  $x_t^{[i]}$  to  $\mathcal{X}_t$ 
10: endfor
11: return  $\mathcal{X}_t$ 
```



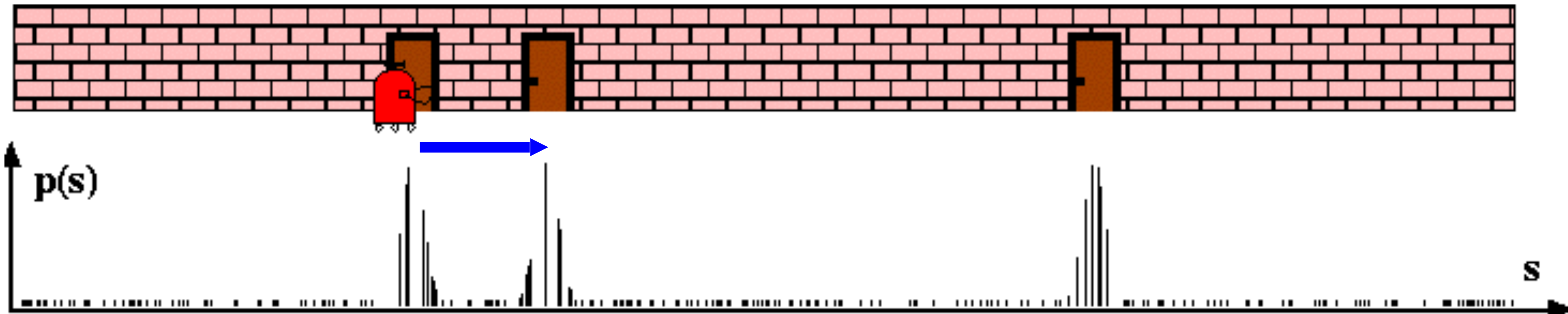
Particle Filters



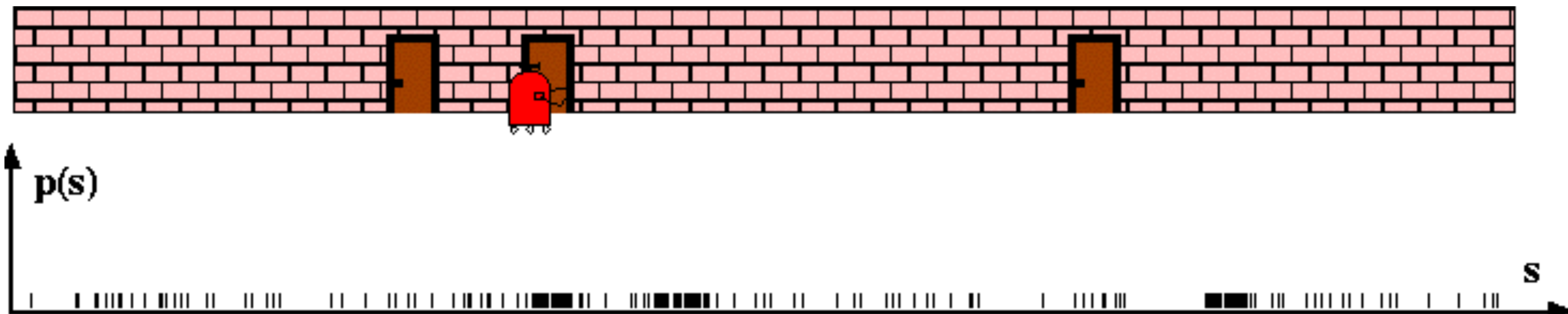
Sensor Information: Importance Sampling



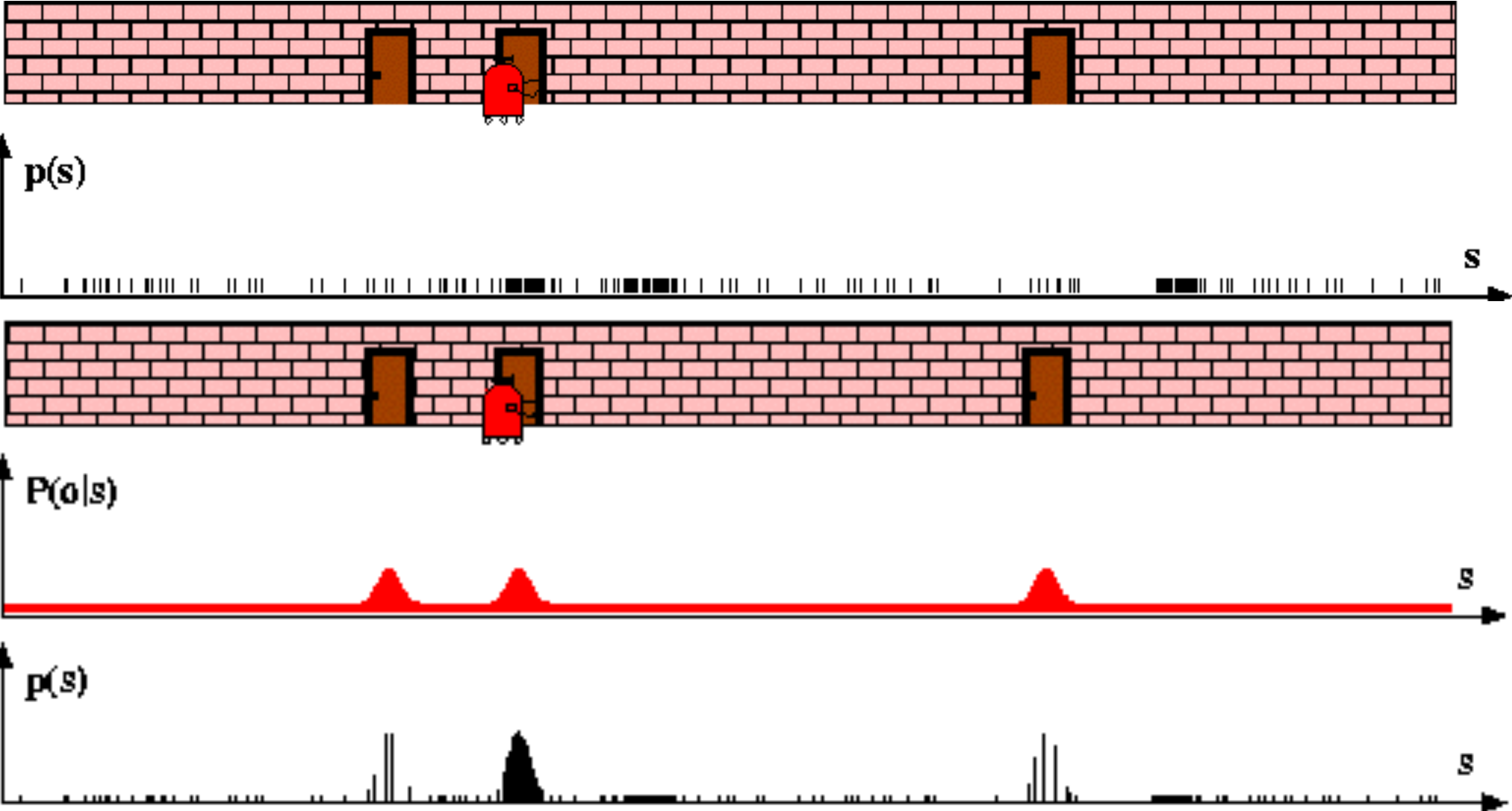
Robot Motion



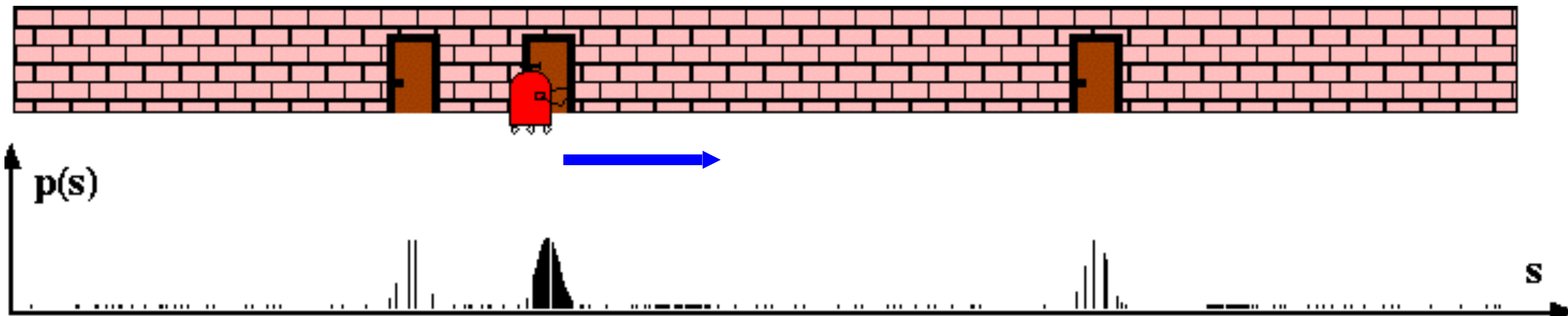
Resampling Step +
Control Input



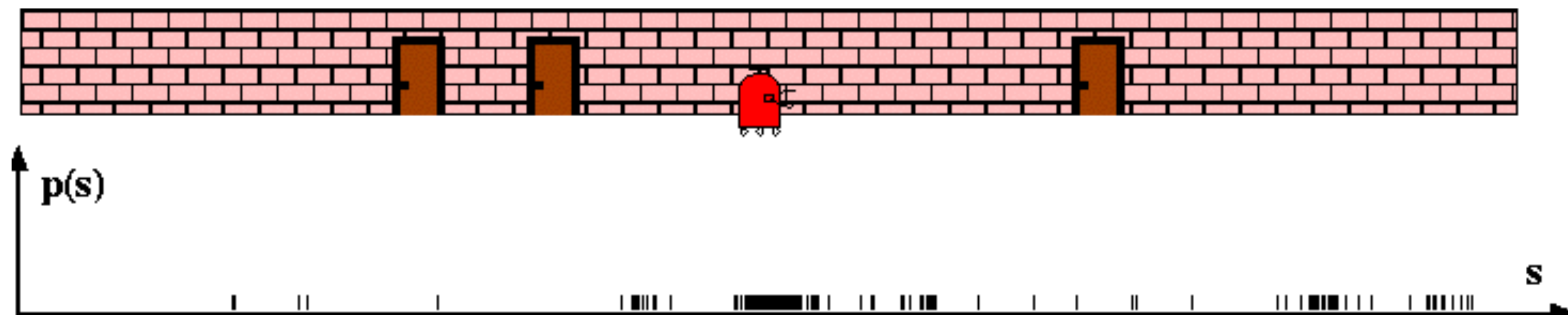
Sensor Information: Importance Sampling



Robot Motion



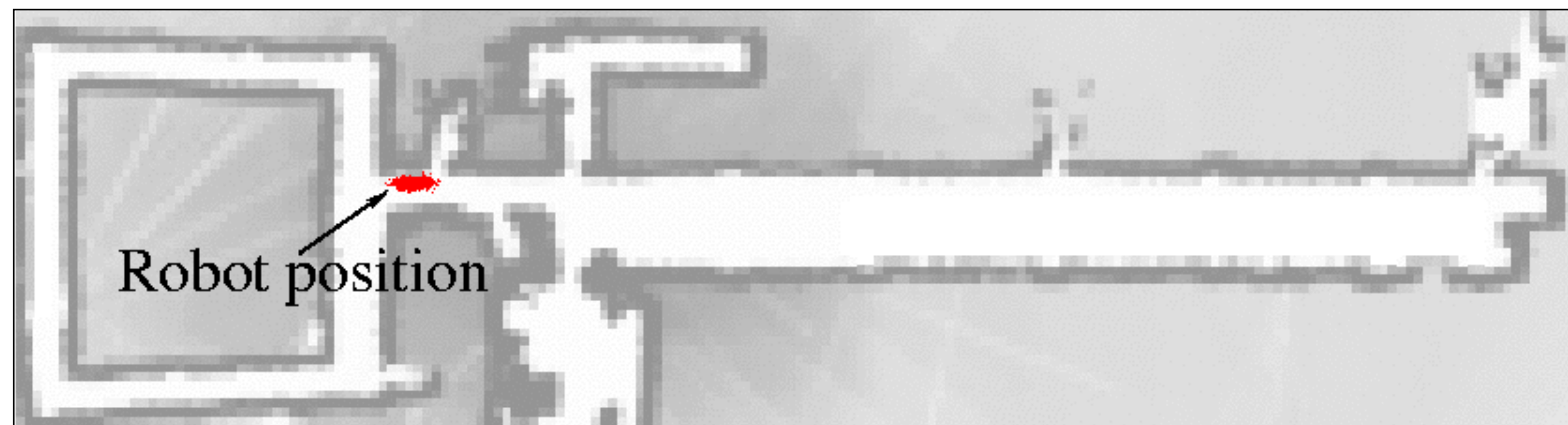
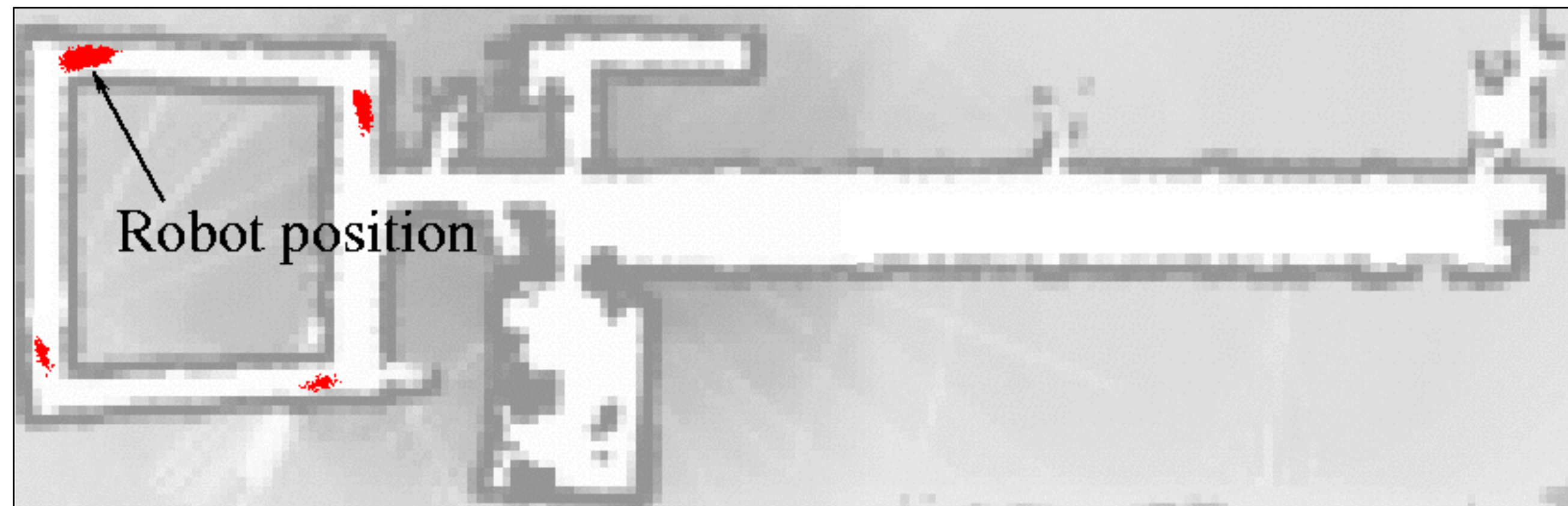
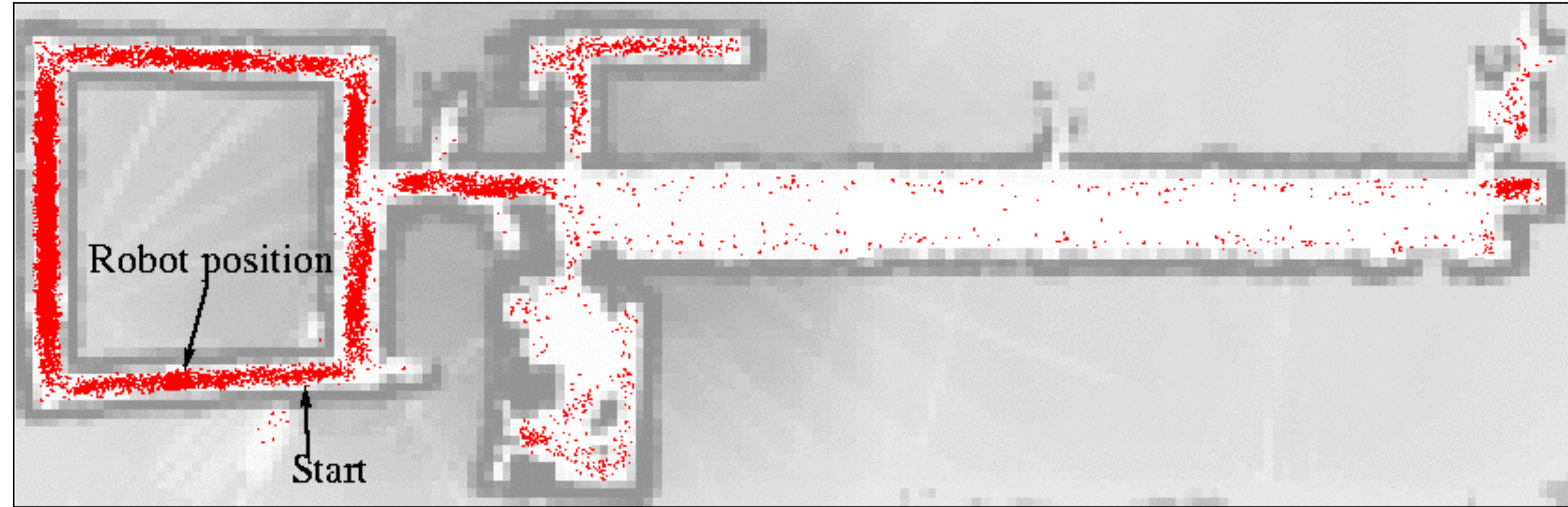
Resampling Step +
Control Input



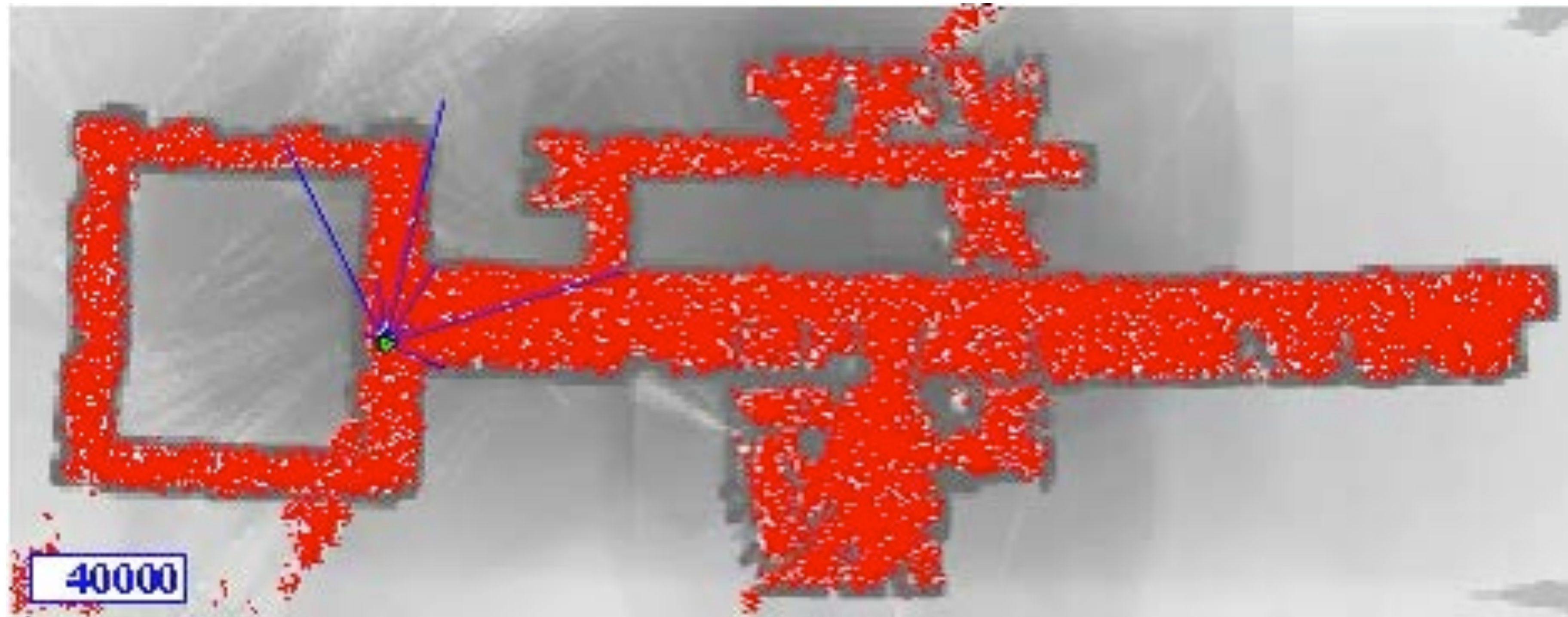
Why have constant number of particles through out?



Adaptive Sampling

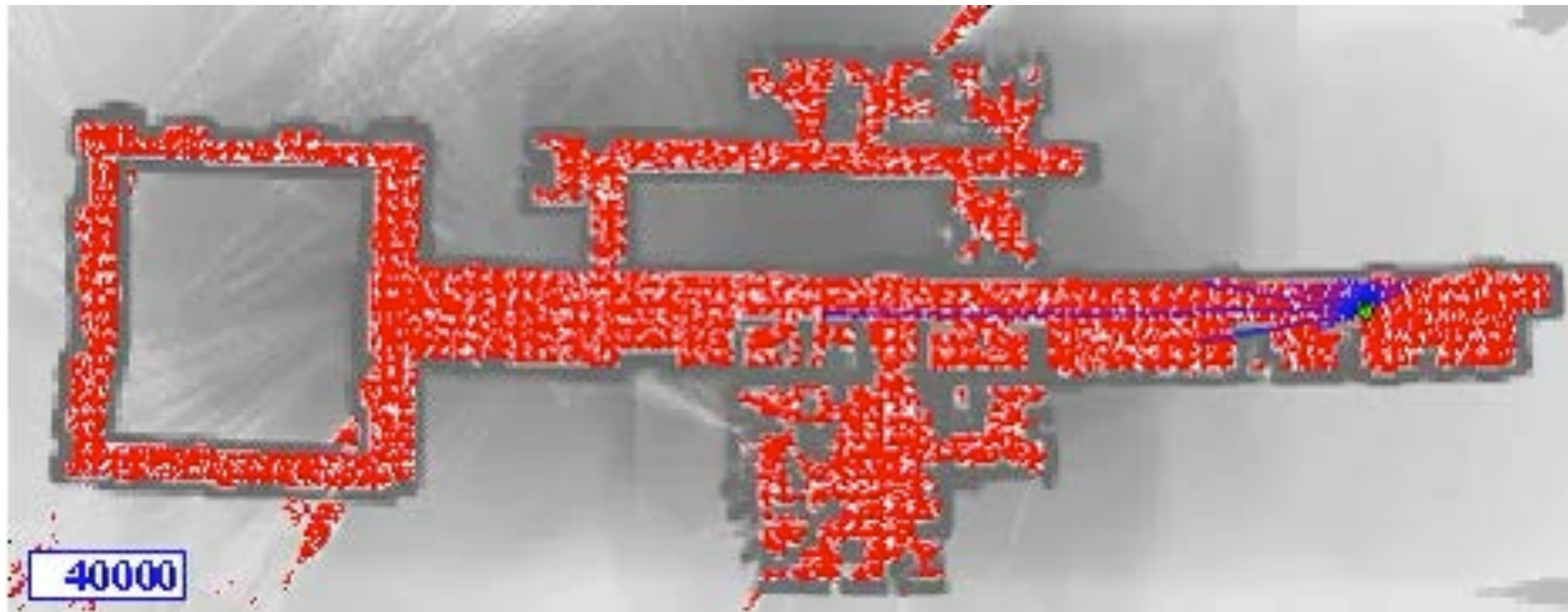


KLD-Sampling Sonar



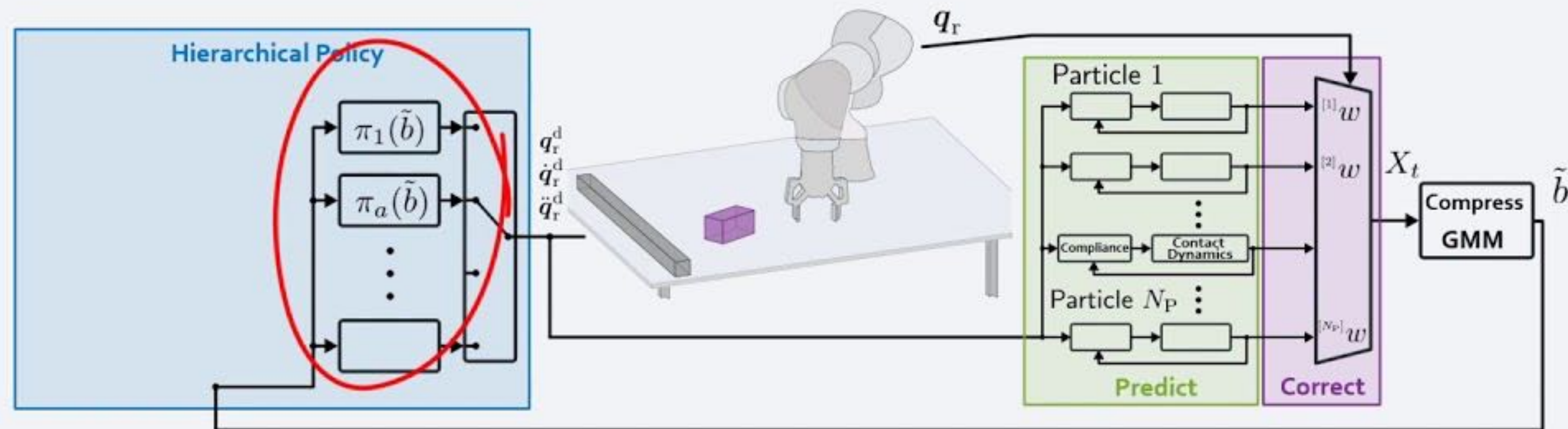
Adapt number of particles on the fly based on statistical approximation measure

KLD-Sampling Laser

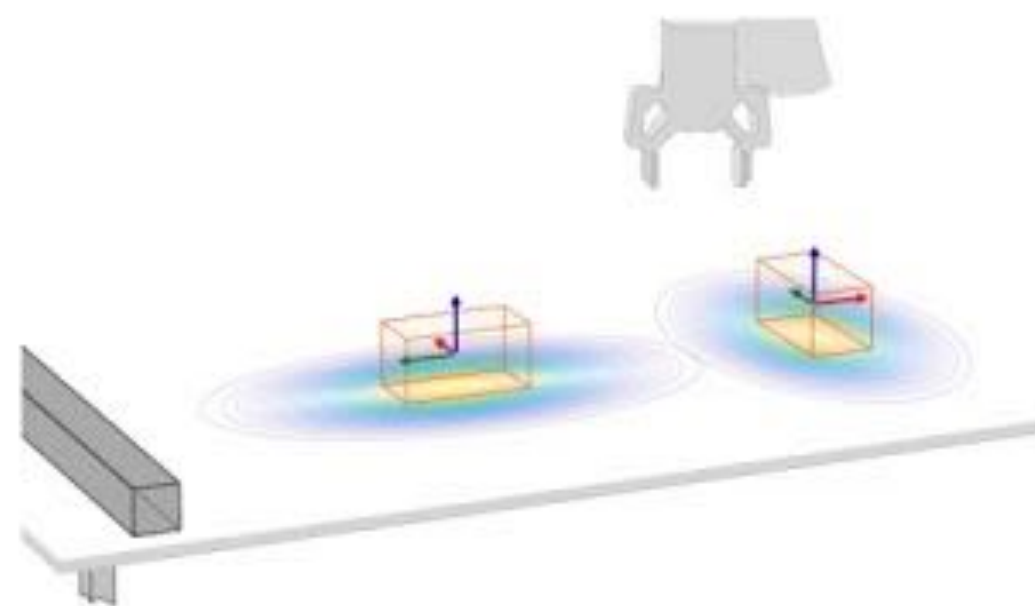


What if the localization is not about the robot?





Hierarchical Policy – Goal-Directed Low-Level Controllers



“Controlling Contact-Rich Manipulation Under Partial Observability”

Florian Wirnshofer (Siemens AG)*; Philipp Sebastian Schmitt (Siemens AG); Georg von Wichert (Siemens AG); Wolfram Burgard (University of Freiburg)

RSS 2020





Zhiqiang Sui, Lingzhu Xiang, Odest Chadwicke Jenkins, Karthik Desingh,
"Goal-directed Robot Manipulation through Axiomatic Scene Estimation," IJRR 2017.

Physically Plausible Scene Estimation for Manipulation in Clutter

Karthik Desingh¹, Odest Chadwicke Jenkins¹,
Lionel Reveret², Zhiqiang Sui¹

¹University of Michigan, Ann Arbor, USA

²INRIA Rhône-Alpes, Saint Ismier, France

Karthik Desingh, Odest Chadwicke Jenkins, Lionel Reveret, Zhiqiang Sui, "Physically Plausible Scene Estimation for Manipulation in Clutter," Humanoids 2016.



Raw Object Detection



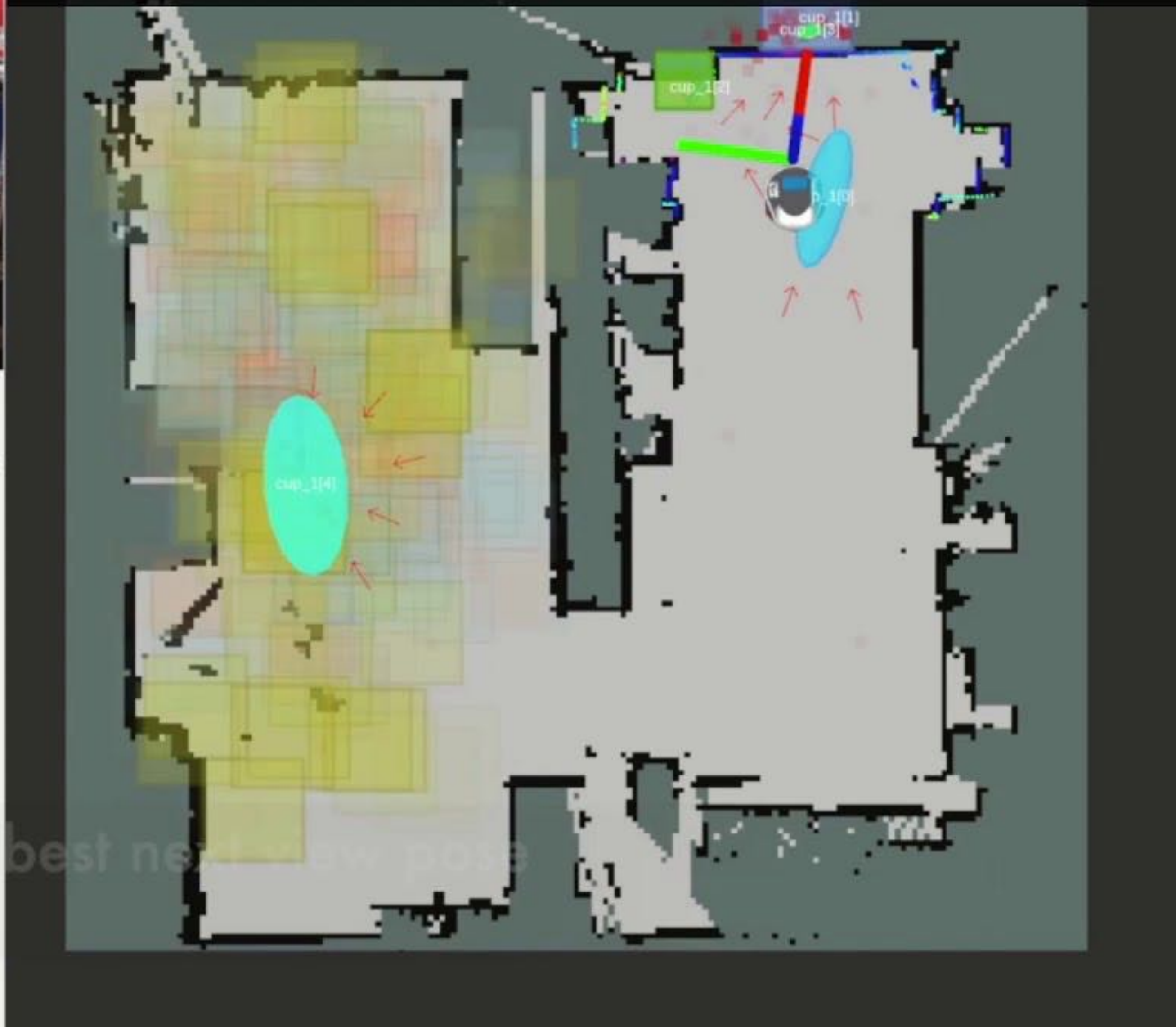
Recognized Objects with Poses



Zhen Zeng, Yunwen Zhou, Odest Chadwicke Jenkins, Karthik Desingh, "Semantic Mapping with Simultaneous Object Detection and Localization," IROS 2018

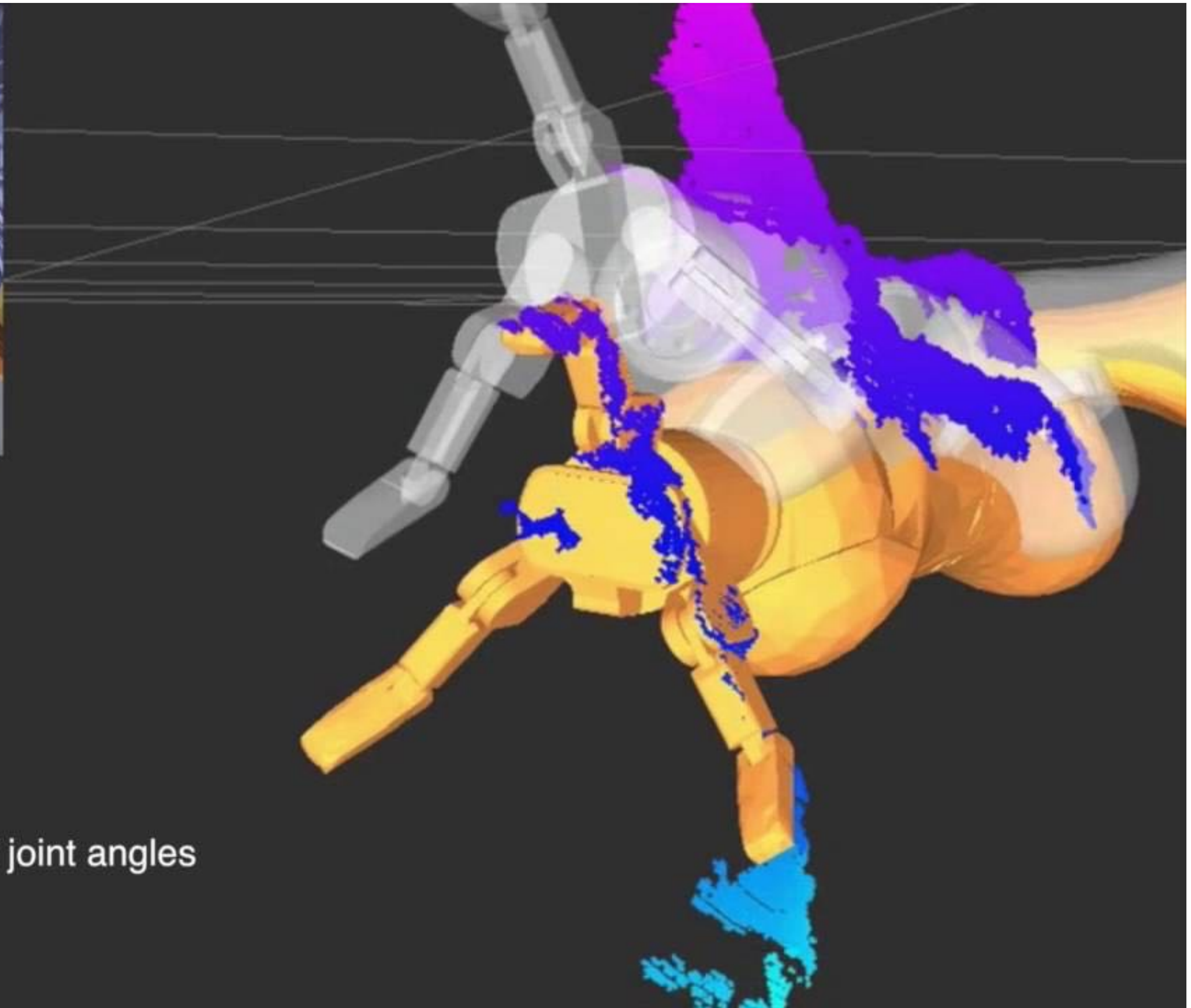


cup sink refrigerator table sofa



Zhen Zeng, Adrian Röfer, Odest Chadwicke Jenkins, "SLiM: Semantic Linking Maps for Active Visual Object Search.," ICRA 2020





Inaccurate arm pose given biased joint angles

Corrected arm pose
given depth images in addition

Probabilistic Articulated Real-Time Tracking for Robot Manipulation. Garcia Cifuentes, Cristina and Jan Issac and Manuel Wüthrich and Stefan Schaal and Jeannette Bohg.
IEEE Robotics and Automation Letters (RA-L) 2017.

Next Lecture: Mapping

