#### Deep Reinforcement Learning-Based Mapless Crowd Navigation with Perceived Risk of the Moving Crowd for Mobile Robots

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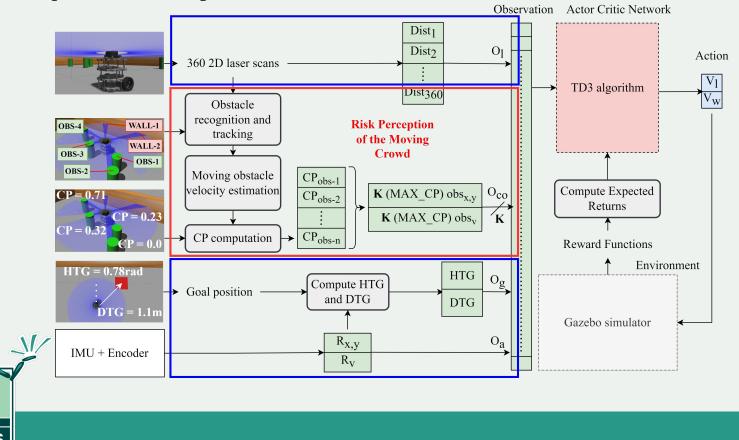


## **Related works**

- Mapless + 2D laserscan + DRL navigation
  - Virtual-to-real navigation (Tai et al., IROS2017)
  - Curiosity-driven exploration (Zhelo et al., ICRA2018)
- Crowd Navigation + DRL
  - CrowdMove (Long et al., ICRA2018)
  - CADRL (Everett et al., IROS2018)
  - Social-safety aware navigation (Jin et al., ICRA2020)

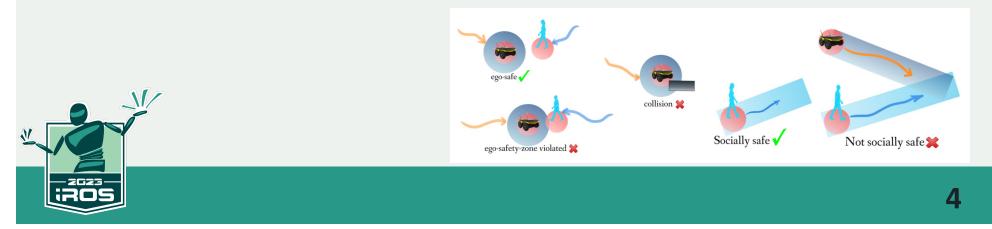


#### **Proposed system**

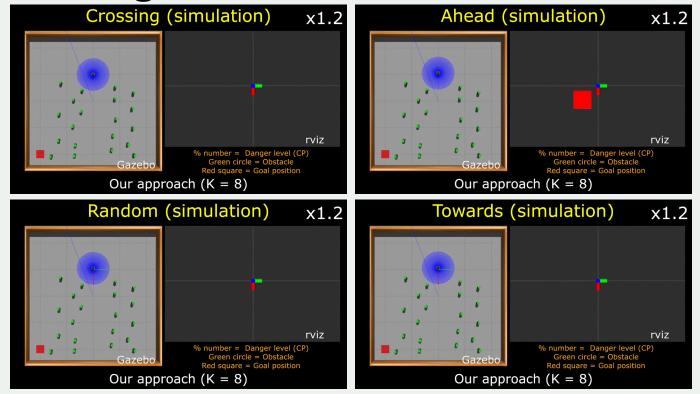


# Navigation performance measure

- Success Rate (0-100%)
- Arrival Time (s)
- Ego-safety Score (0-100%) (Jin et al., ICRA2020)
- Social-safety Score (0-100%) (Jin et al., ICRA2020)



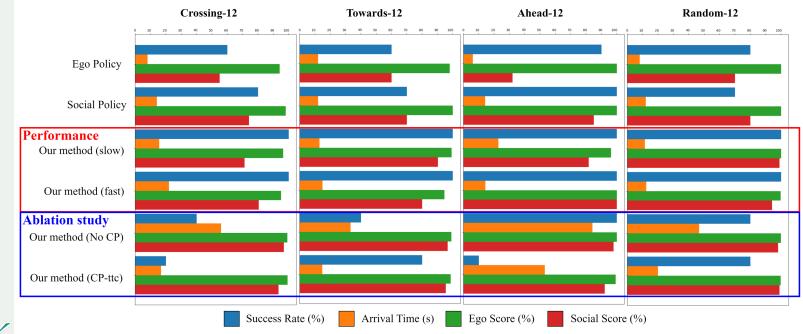
#### **Crowd navigation: Tests**





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#### **Crowd navigation: Results**





Our proposed method achieves higher success rates.

The ablation study highlights the effectiveness of our approach.

# Conclusion

- Mapless crowd navigation approach has been presented
  - DRL + Mapless + Risk Perception with 2D laser scans
- The inclusion of Risk Perception to the observation space can significantly improve crowd navigation performance.
  - The perception of risk has enabled the robot to take Mcalculated risk in navigating the crowd.



## **Future works**

- Expand the simulated and real-world tests, and improve real-world performance.
- Investigate further ways to incorporate perceived risk or human awareness in our crowd navigation approach.

