# Adaptive Parallelization of Multi-Agent Simulations with Localized Dynamics

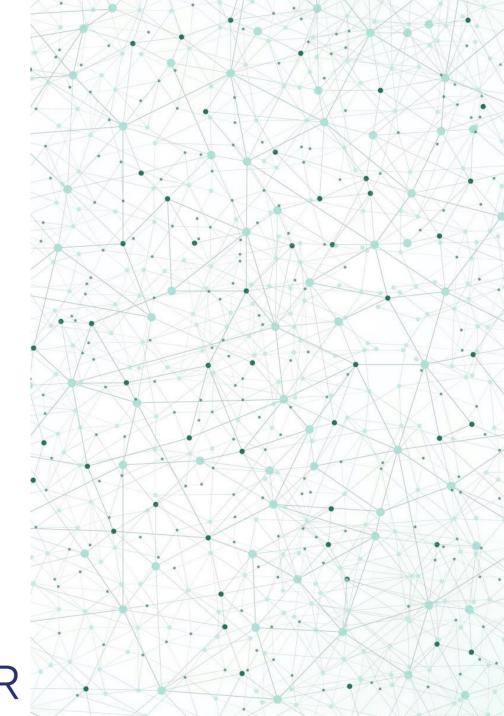
**Alexandru-Ionuţ Băbeanu**, Tatiana Filatova, Jan H. Kwakkel, Neil Yorke-Smith

The 24<sup>th</sup> International Workshop on Multi-Agent-Based Simulation

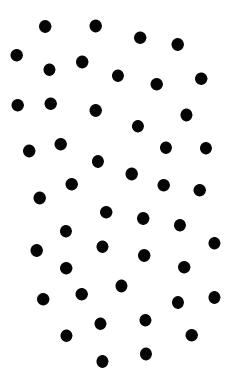
30 May 2023



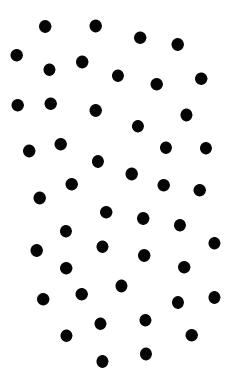




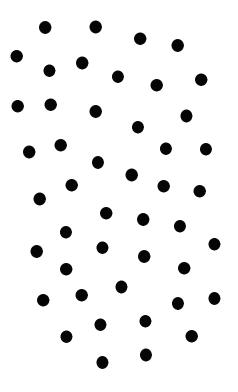
MABS are computationally very demanding



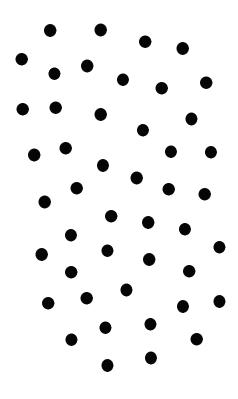
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- One acceleration strategy combines:
  - System modularity
  - Multicore parallelism

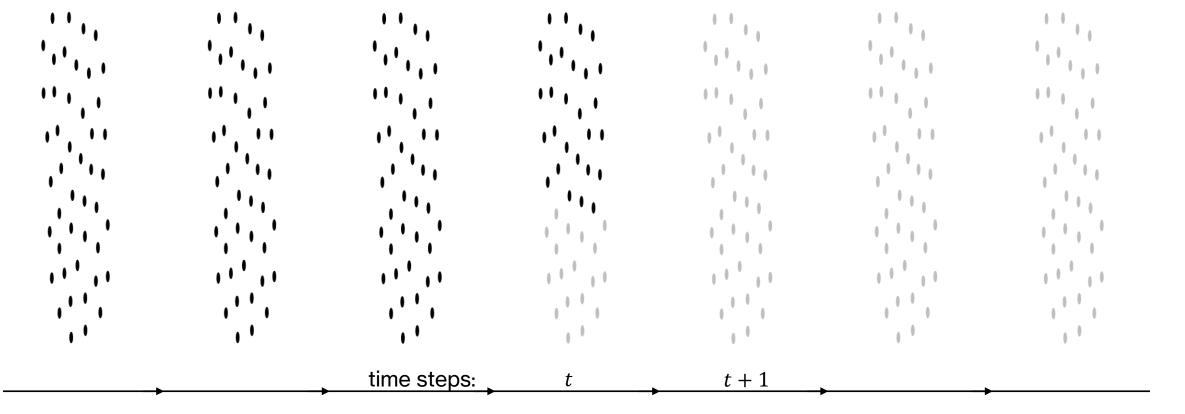


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- But there are complications:
  - Shared information, interactions
  - synchronization-related waiting



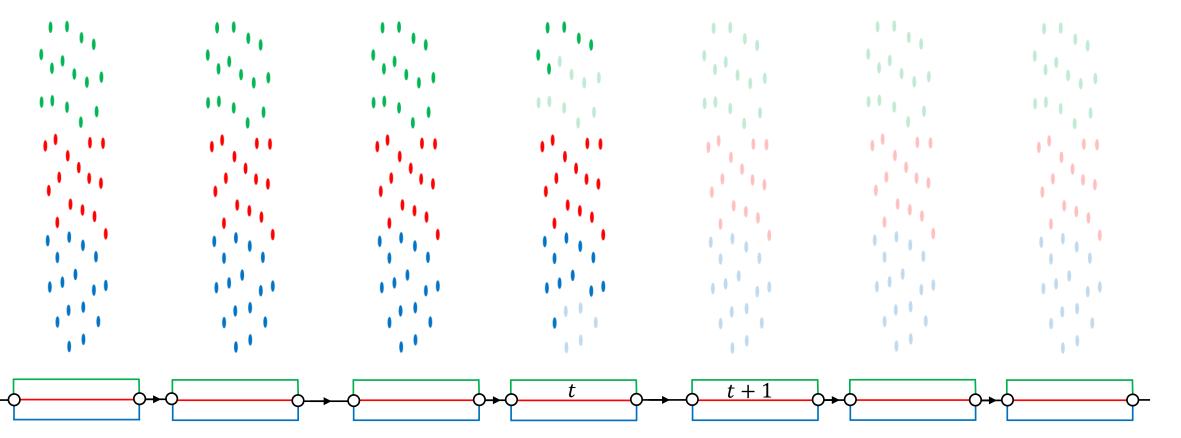
# **General intuition**

• No parallelization:



#### **General intuition**

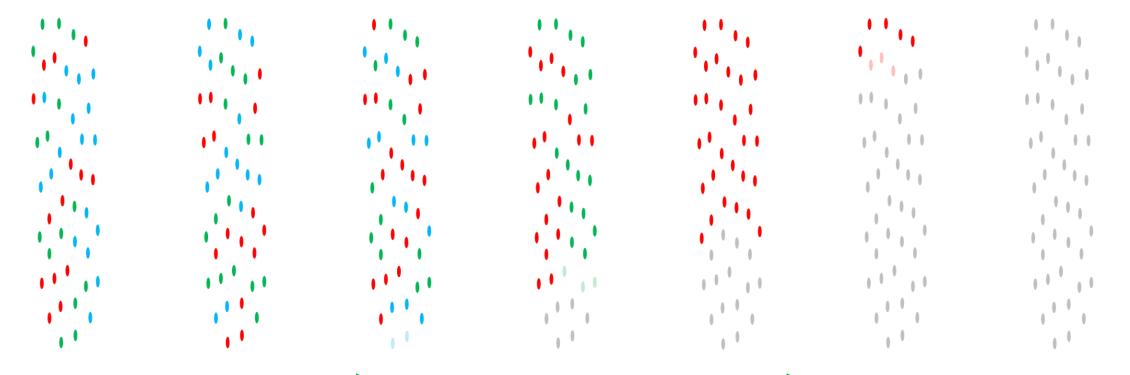
• Conventional parallelization (rigid, top-down):



# **General intuition**

• Desired parallelization (adaptive, bottom-up):

t-1



t + 1

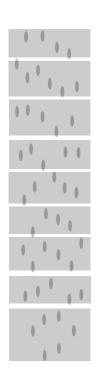
t + 2

Need-based preregistration of updates

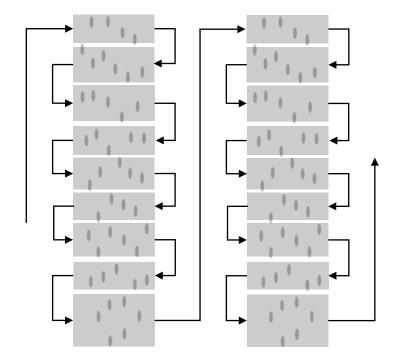


- Need-based preregistration of updates
- Updates grouped into tasks

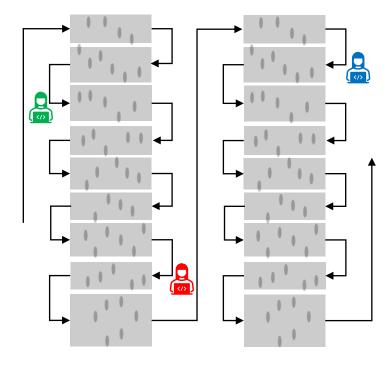




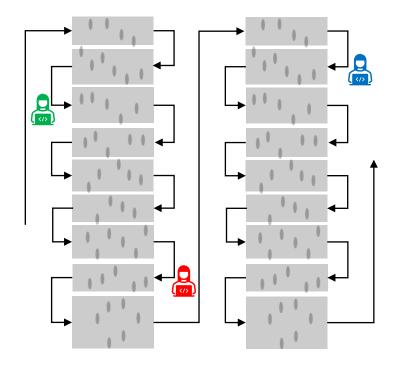
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- Updates grouped into tasks
- Tasks linked within dynamic chain
- Several workers (equal roles) operating on chain
- Gracefully handling dependence relations
- Shared-memory paradigm
- Relatively easy to plug in any model



#### **Experimental results**

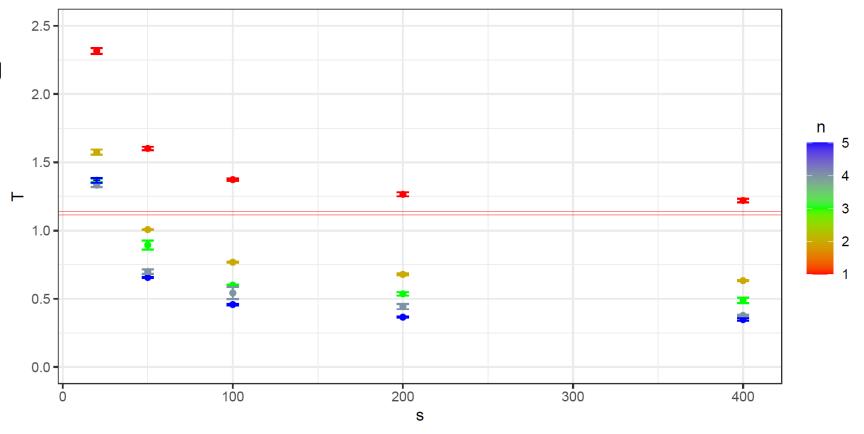
#### Model specifications:

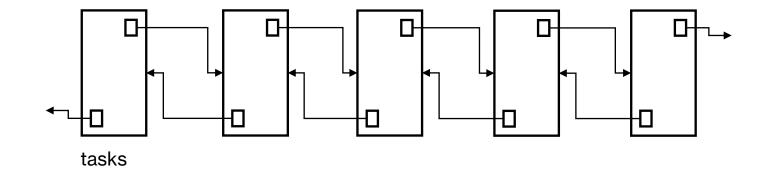
- SIR-type disease spreading
- 4000 agents
- Ring-like network
- 14 links per node
- 3000x2 steps
- 2 types of agent updates:
  - Computing new state
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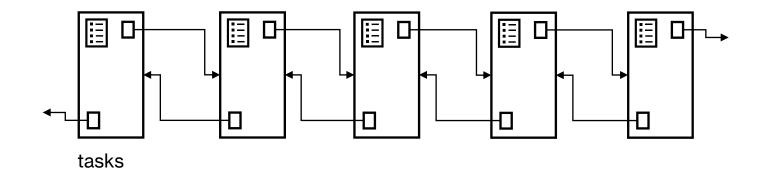










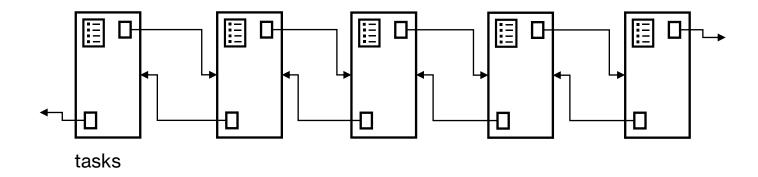


task **recipes** 









worker records

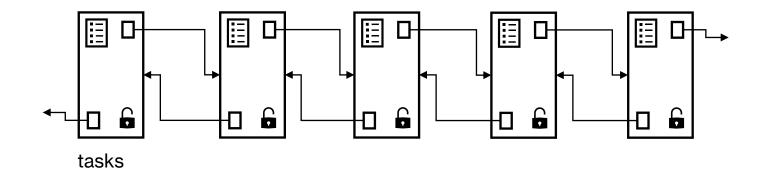












task mutex locks

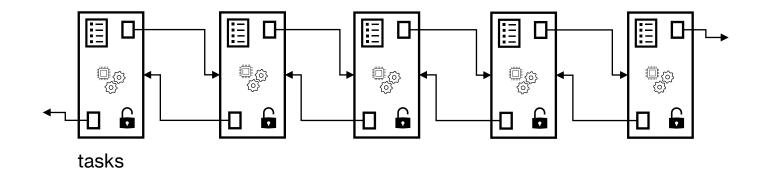












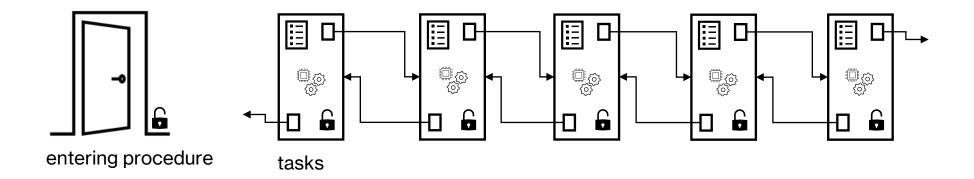
task execution flags









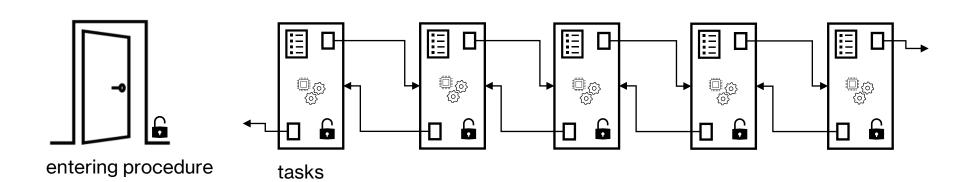












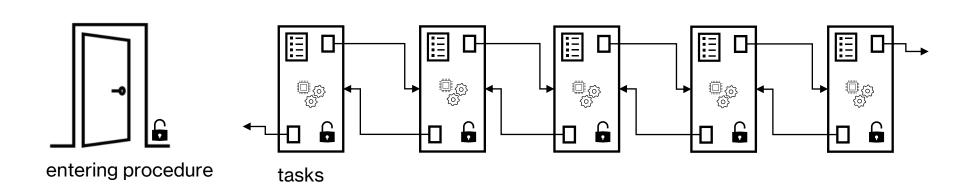
















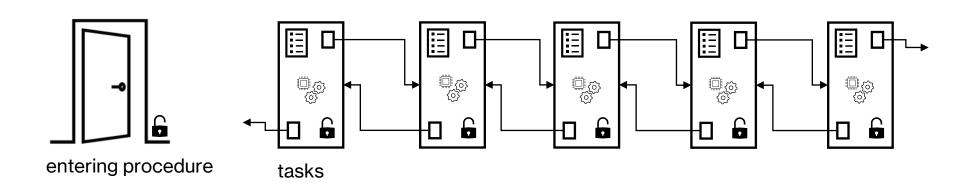






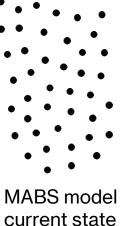












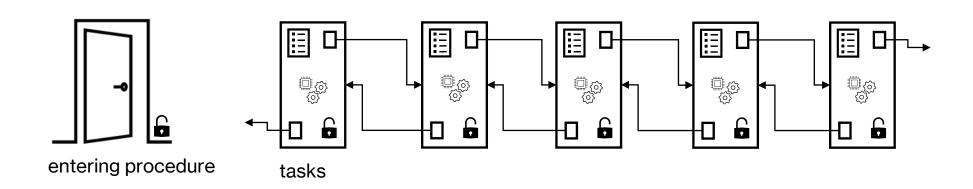








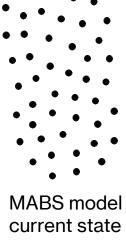










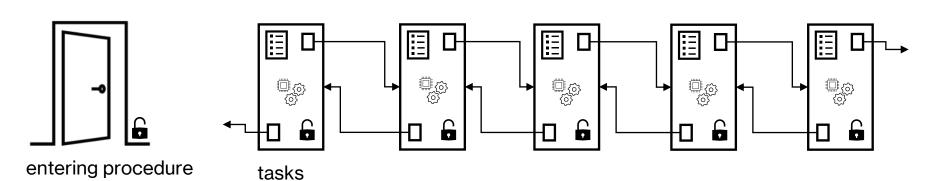
















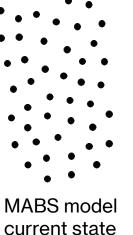




record

class















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- Workshop-version article (also) available online: arXiv:2304.01724

# **Backup**

# More experimental results

