## PhD Open Days







## Solving Distributed Systems' Problems using Reinforcement Learning

PhD in Computer Science and Engineering

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• Distributed algorithms are the support of modern technologies such as:

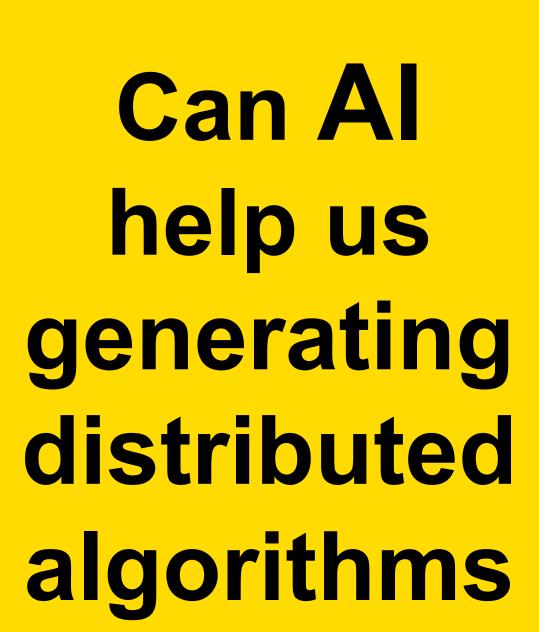




However, implementing distributed algorithms is:











- 1. Automatically generate correct and efficient fault-tolerant distributed algorithms
- 2. Use Reinforcement Learning techniques to:
  - 1. Generate known algorithms for specific cases
  - 2. Generate new algorithms to advance the state-of-the-art
  - An automatic generation process that learns to generate algorithms based on *Reinforcement Learning*
  - An automatic verification process that uses a model-checking tool (*Spin*) to validate the correctness of the generated algorithms
  - No need for concrete solutions of prior distributed algorithms
  - First work to adopt a machine learning technique on the generation of fault-tolerant distributed algorithms





Proposed

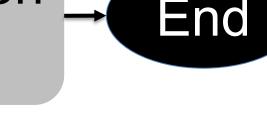
Solution

## **Architecture of the solution**

Start 

1) Input Phase 
Phase

3) Optimization Phase



- 1) Definition of the requirements to generate and verify the algorithms (e.g. type of failures, fault-tolerance ratio, thresholds, ...)
- 2) Based on the requirements, our solution generates and verifies multiple algorithms, receiving positive and negative rewards, based on the correctness of the algorithms generated
- 3) A correct and efficient algorithm (optimal algorithm) is generated based on the knowledge from the Generation Phase





- 1: when RB-Broadcast(m) do:
- 2: SEND to neighbours(< type0, m>) if true and not already sent;
- : STOP if true;
- 4: when  $receive(\langle t, m \rangle) do$ :
- 5: SEND to neighbours(< type1, m>) if received (< type0, m>) from 1 distinct parties and not already sent;
- 6: SEND to neighbours( $\langle type1, m \rangle$ ) if received ( $\langle type1, m \rangle$ ) from F+1 distinct parties and not already sent;
- 7: DELIVER(<m>) if received (<type1,m>) from F+1 distinct parties and not already delivered;
- 8: STOP if true;
- First study applied to the generation of Reliable Broadcast algorithms
  - New Byzantine-tolerant Reliable Broadcast algorithm generated

