### Multi-Agent (Smart) Systems with Virtual Stigmergies

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# Systems of agents



### Sources of complexity

- Large number of agents
- Open-endedness
- Asynchronous interaction

## **Emerging Behaviour**



#### Vision

- High-level language
- Structure-preserving encoding
- Symbolic verification
- Structure-aware decision procedures
- Concepts from the MAS community
- Methodologies from the FM/verification communities

#### Vision

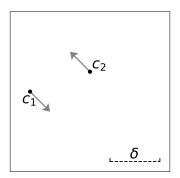
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### Language: LAbS

- A Language with Attribute-based Stigmergies
- Stimergies: indirect propagation of knowledge
- Inspired by biologic systems
- Attribute-based: language user can configure the interaction mechanism

- Two agents  $c_1, c_2$  in a  $G \times G$  arena
- Each agents moves in a direction  $(d_x, d_y)$ , stored in the stigmergy
- ullet Attribute-based predicate: interaction may happen if distance  $<\delta$

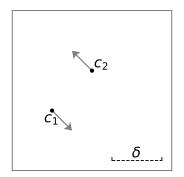
$$P \triangleq x, y \leftarrow x + d_x \bmod G, y + d_y \bmod G; P$$



Initial state

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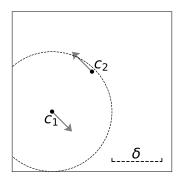
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 $c_1$  reads  $(d_x, d_y)$  and moves

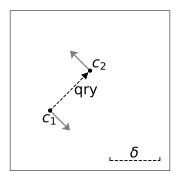
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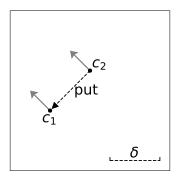
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qry: agent asks for confirmation on  $(d_x, d_y)$ 

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put: c<sub>2</sub> propagates his (newer) value

### Encoding

Multi-robot systems Gossiping protocols Population protocols Flocking, foraging, . . .

Encoding

#### Under-approximation

- Bounded MC
- Symbolic execution
- Statistical MC, . . .

Over-Approximation

- Abstract interpretation
- Predicate abstraction, . . .

Unbounded analysis

- K-induction
- IC3, . . .



- Compact
- Embedded scheduler

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Under-approximation

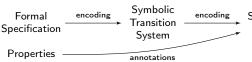
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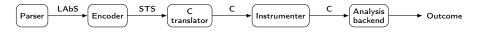


Sequential Program

- Compact
- Embedded scheduler

#### **SLiVER**

### Symbolic LAbS Verification<sup>1</sup>



Aim: Push-button analysis Modularity

- Backend
- Target language

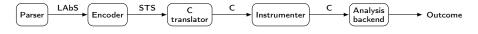
  - ► LNT: explicit MC, simulation

https://github.com/labs-lang/sliver/

<sup>&</sup>lt;sup>2</sup>CADP, https://cadp.inria.fr/

#### **SLiVER**

### Symbolic LAbS Verification<sup>1</sup>



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### Preliminary results: unbounded analysis

- Safety: Absence of assertion violations
- Liveness: Eventual reachability (encoded as termination)

System	Property	Bounded model checking <sup>3</sup>	Summarization	13	Symbolic execution	Predicate analysis
formation-safe	L	•	?	_		-
formation-safe	S	_	•	•	•	•
flock-safe	L		•	_	?	_
majority-safe	S	-	?	•		•
majority-safe	L		?	_	•	

- Correct result
- ? Analysis inconclusive

Not supported

(empty) Out of time/memory

<sup>&</sup>lt;sup>3</sup>(with completeness threshold)

#### Future work

- Correctness of the encoding
- Structure-aware reasoning
- Unbounded number of agents (inductive proofs?)
- Completeness threshold (for under-approximation)
- Distribute/speed up analysis

#### References

- 1. R. De Nicola, L. Di Stefano, and O. Inverso, "Toward Formal Models and Languages for Verifiable Multi-Robot Systems," Front. Robot. Al, vol. 5, 2018.
- 2. R. De Nicola, L. Di Stefano, and O. Inverso, "Multi-agent Systems with Virtual Stigmergy," to appear in Sci. Comput. Program.
- 3. R. De Nicola, L. Di Stefano, and O. Inverso, "Verification of Multi-agent Systems with Stigmergic Interaction," under submission.

## C encoding sketch (1/2)

```
N = ... // Number of agents
K I = ... // Number of attributes
K L = ... // Number of stigmergy keys
B = ... // Number of transitions
int v[N]:
                                           // v[i] --> program counter for agent i
int I[N][K_I], Lvalue[N][K_L], Ltstamp[N][K_L]; // integer values for all kevs
bool Zc[N][K_L], Zp[N][K_L] // Zc[i][j]=1 --> key j is in Zc of agent i (or Zp)
/* System-level actions */
void attr(int id, int key, int value) { ... } // encodes "key <- value"</pre>
void lstig(int id, int key, int value) { ... } // encodes "key <~ value"</pre>
bool link(int a, int b, int key) { ... } // link predicate true iff. I_a, L_a, I_b, L_b \vDash \varphi_{key}
void confirm(void) { ... }
void propagate(void) { ... }
/* Agent-level actions */
void stmt0(int tid) { ... }
void stmt1(int tid) { ... }
// ...
/* Initialisation and properties to verify */
void init() { ... }
void monitor(void) { assert ( \varphi ) }
void check(void) { if (\varphi) exit(): }
```

## C encoding sketch (2/2)

```
int nextAgent(int agent) { ... } // Scheduler assumptions
/* Scheduler */
int main(void) {
 init();
 int agent = *;
  assume(agent < N);</pre>
  while (1) { // execution loop
    if ( * ) {
      switch (choice) {
        case 0: stmt0(agent);
        case 1: stmt1(agent);
        // ...
    else {
     if ( * ) propagate();
      else confirm();
    monitor():
    check();
    agent = nextAgent(agent);
```