

# Emerging Synchrony in Applauding Audiences

Formal Analysis and Specification

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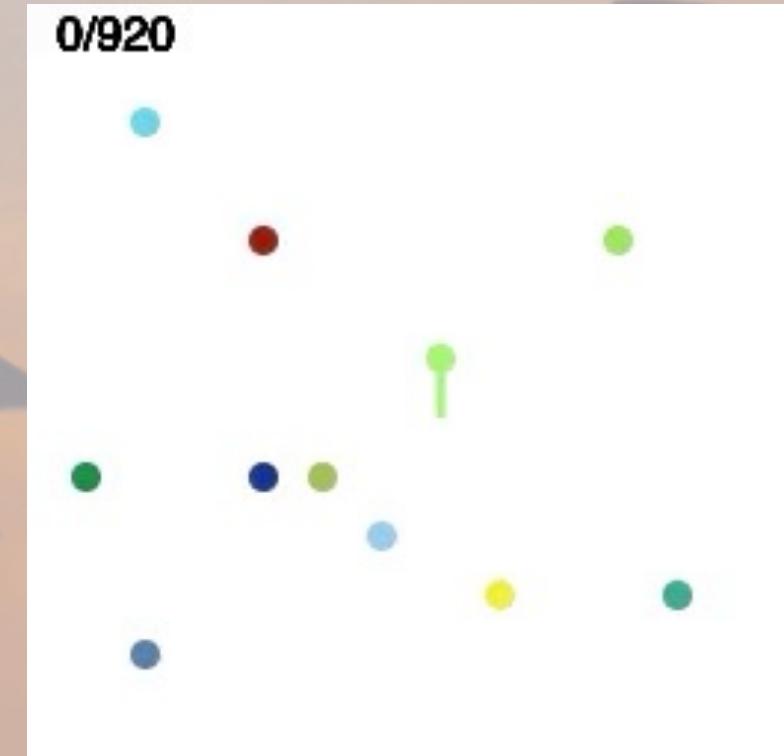
REoCAS Colloquium, ISoLA, 29 Oct 2024

# The Story So Far

From this... (2019)

PHOTO: [AMIRHOSSEIN KHEDRI](#), UNSPLASH. ANIMATION: DE NICOLA, DI STEFANO, INVERSO ([LINK](#))

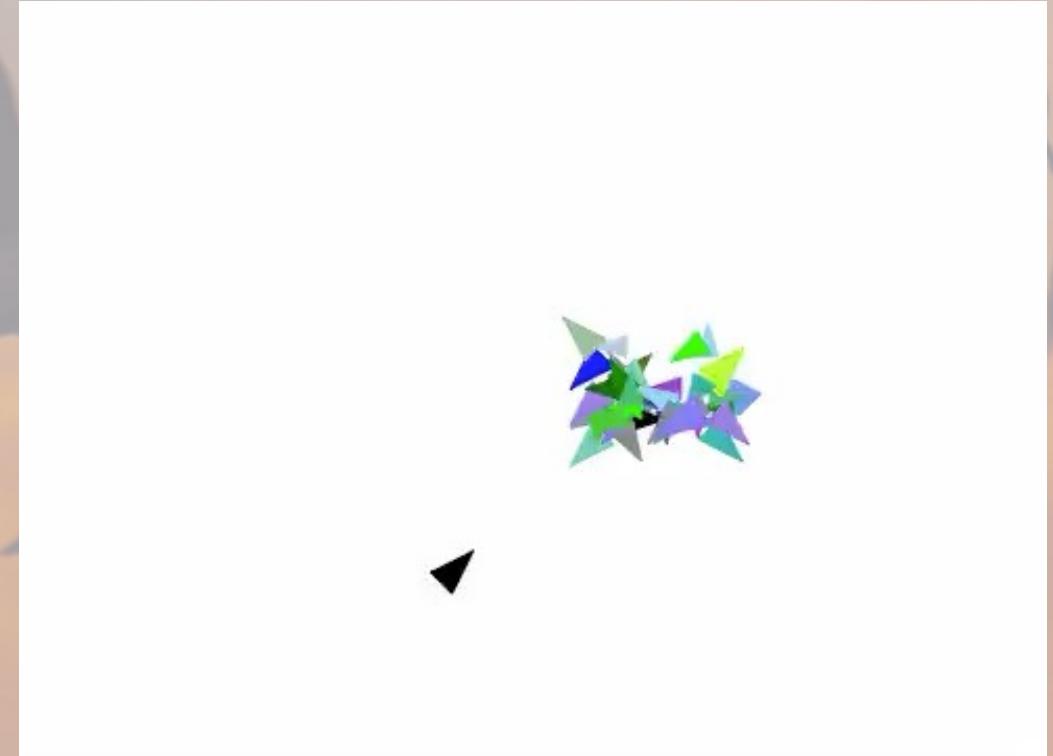
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# The Story So Far

To this... (2022)

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# The Story So Far

...And this (2023)

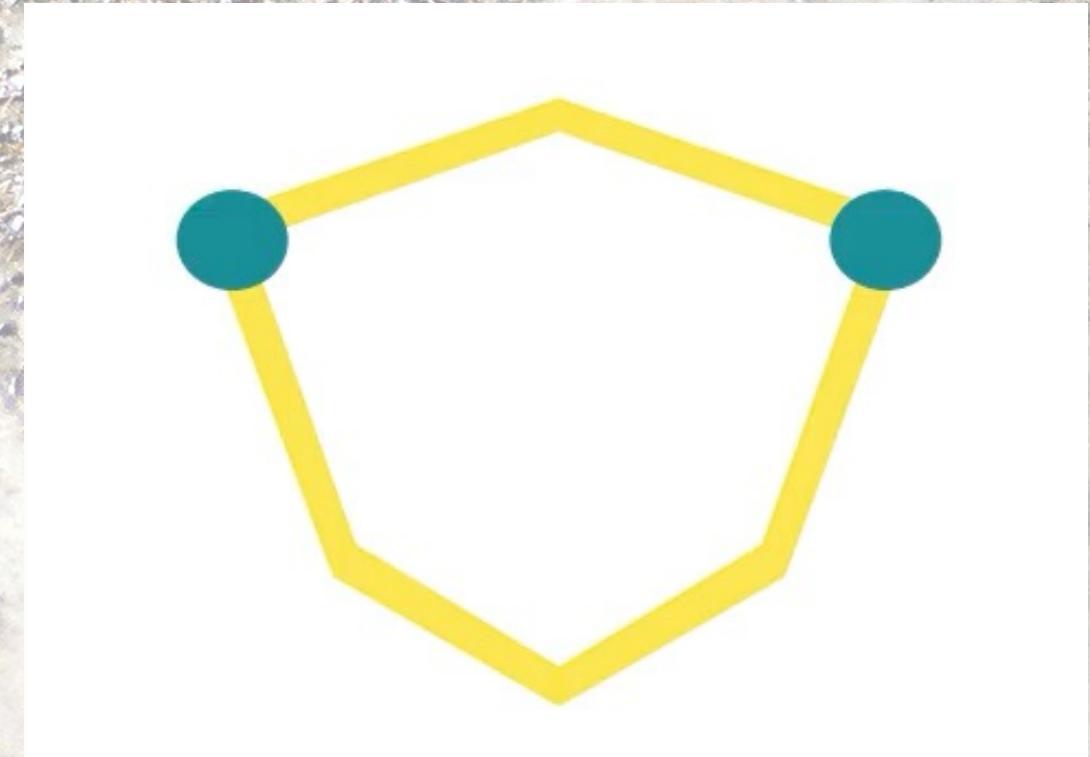


PHOTO: [AMIRHOSSEIN KHEDRI](#), UNSPLASH. ANIMATION: DE NICOLA, DI STEFANO, INVERSO, VALIANI ([LINK](#))

# Another Example of Collective Behaviour



SOURCE: [HTTPS://WWW.YOUTUBE.COM/WATCH?V=AU5TGPPCPUS](https://www.youtube.com/watch?v=AU5TGPPCPUS)

# Our Contributions

- Formal **specification** of a clapping audience
- (Minor **extensions** to the formal language we used)
- **Simulation** through an automated workflow
- Verification that convergence is **stable** (in our model)

# Our Specification in a Nutshell

- Each agent claps at its own **frequency**
- Agents can **listen** to audience
- When many agents clap at the **same moment**...
- ...Other agents can **sense** it...
- ...and try to **synchronise** with that collective rhythm

- Specification of collective adaptive systems
- Original focus:<sup>1</sup>
  - Virtual stigmergies (replicated **key-value stores**)
  - Attribute-based Communication
  - Shared memory was also allowed
- More recently: agents observe and react to exposed features (**attributes**)<sup>3,4</sup>

<sup>1</sup>De Nicola, Di Stefano, Inverso. Multi-agent systems with virtual stigmergy. Sci. Comput. Program. 20202

<sup>2</sup>De Nicola et al. Modelling flocks of birds and colonies of ants from the bottom up. STTT, 2023

<sup>3</sup>De Nicola et al. Intuitive Modelling and Formal Analysis of Collective Behaviour in Foraging Ants. In CMSB'23

# Modelling Challenges

- LAbS assumes one action per time step, but we have to model agents that act at the **same time** (similar to cellular automata)
  1. Restrict interleaving (rounds with 1 action per agent)
  2. Store “intermediate” state updates separately
- Allow an agent to count how many agents of type T satisfy  $\varphi$  (e.g., how many are clapping right now):

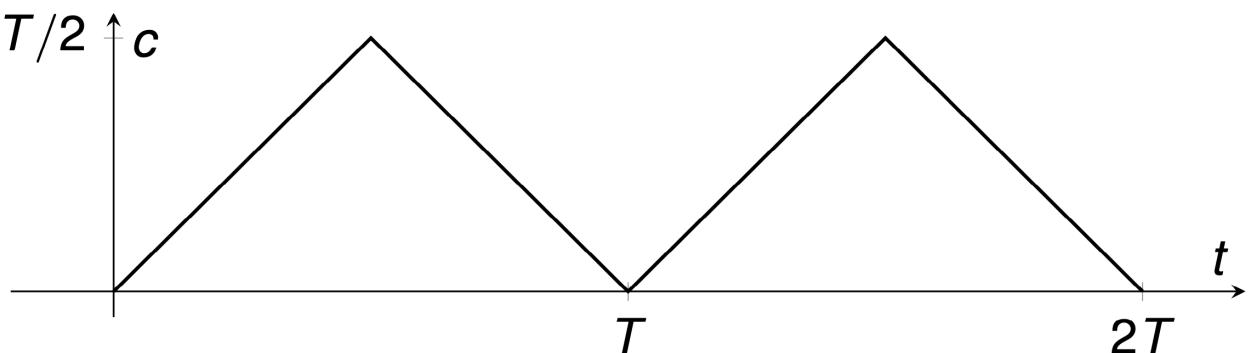
$$\text{result} := \mathbf{count} \, T \, x, \varphi(x)$$

# Individual Clapping

- $T$  clapping period
- $c$  counter variable: when 0, the agent is clapping
- $sign$  whether  $c$  should increase or decrease

Repeat forever:

```
sign := if c = 0 then 1 else
        if c = T / 2 then -1 else sign
c := c + sign
```



# Listening

- Check how many agents are clapping
- Use a **threshold** value to distinguish loud moments
- Track the time interval  $\theta$  between loud moments

```
audienceClap := count Agent  $i, c_i = 0$ 
 $\theta := \begin{cases} 0 & \text{if } audienceClap \geq loud \\ \theta + 1 & \text{else} \end{cases}$ 
```

- After 2 loud moments, agents can compare their own  $T$  with the time interval  $\theta$  between them
- New  $T$  = average of old  $T$  and  $\theta$
- (Bounded by parameters  $Tmin, Tmax$ )

$$T := (T + \theta) / 2$$

$$T := \min(\max(Tmin, T), Tmax)$$

Other adaptation mechanisms (see our paper!)

- Lower loudness threshold if loud moments are too few
- Increase loudness threshold if loud moments are many
- If  $T = \theta$  and agent not in sync, adjust phase

# Experimental Setting

	Name	Meaning	Initial value(s)
Variables	$T$	Clapping period	$T_{min}, \dots, T_{max}$
	$c$	Clapping counter	$1, \dots, T/2$
	$sign$	How $c$ should be updated	1
	$loud$	Loudness threshold	$loud^{(0)}$
	$\theta$	Time interval between loud moments	$-\infty$
Parameters	$N$	Number of agents	16
	$T_{min}$	Minimum value for $T$	8
	$T_{max}$	Maximum value for $T$	20
	$loud^{(0)}$	Initial loudness threshold	4

# SLiVER<sup>1</sup> for SAT-based Simulation

- LAbS specification  $\Rightarrow$  sequential C program<sup>2</sup>
- Use off-the-shelf verification tools for C
- SAT-based BMC + Nondet heuristics + assertion that is violated after  $B$  steps = random execution traces

## Problem

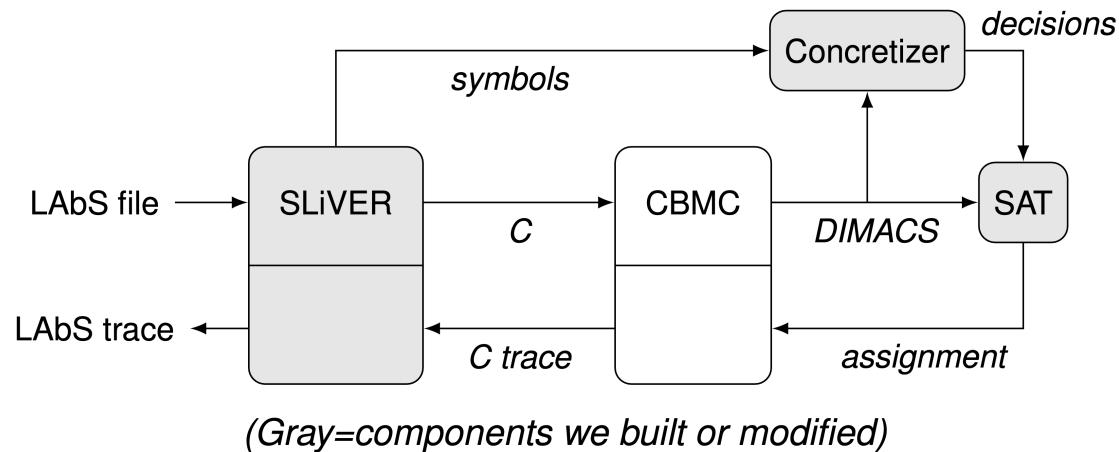
- Tool encodes nondeterministic state by **symbolic variables** (for verification purposes)
- Decision **not efficient**, esp. with nondet heuristics

<sup>1</sup><https://github.com/labs-lang/sliver>

<sup>2</sup>Di Stefano, De Nicola, Inverso. Verification of Distributed Systems via Sequential Emulation. TOSEM, 2022

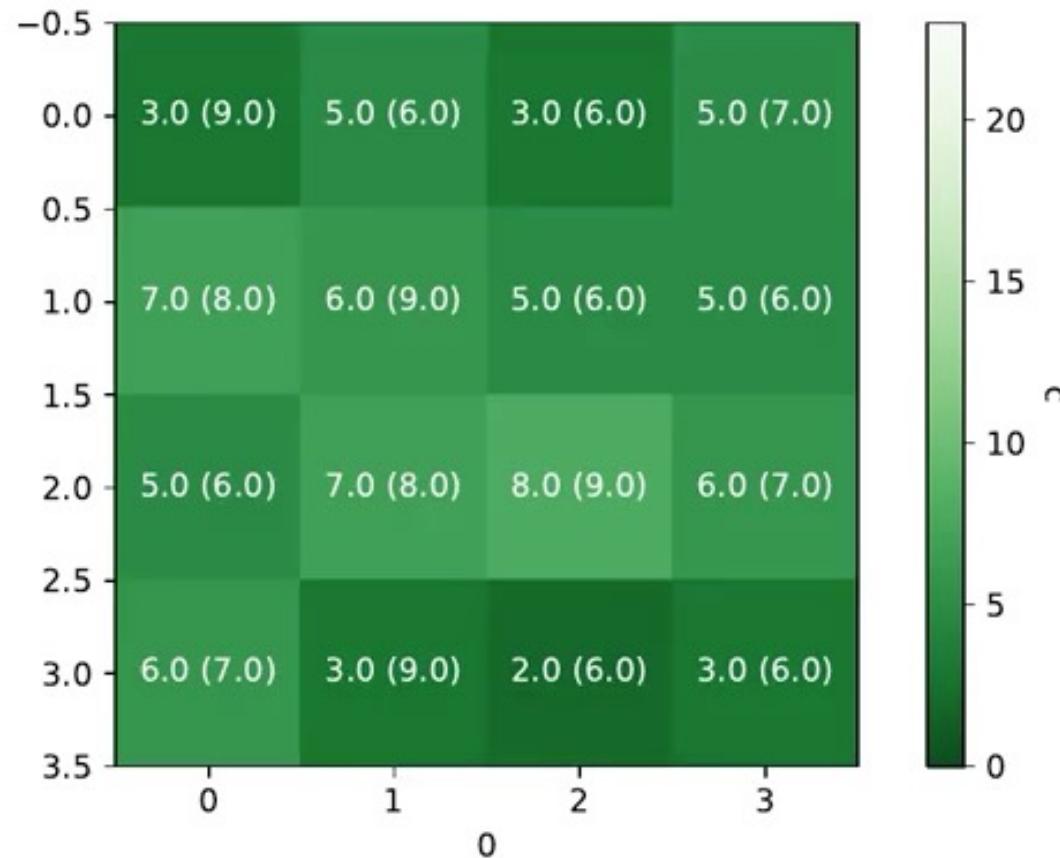
# Concretization

- **Simulation**: no need to explore multiple initial states
- Tell SAT to use **one** (random) value for each variable
- Still allow SAT to **backtrack**
- (Applicable to any nondet variable that can be guessed statically)



# A Sample Simulation

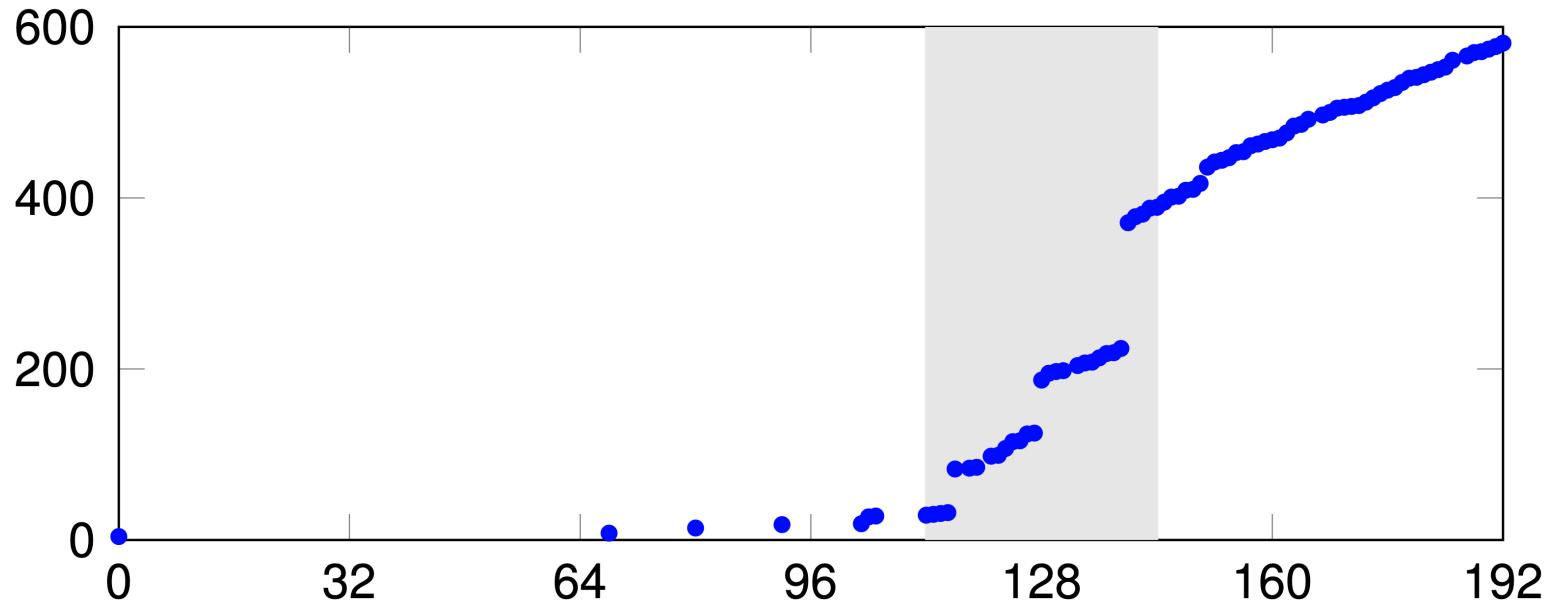
`tsl = -1`  
`loud = 4`



AVAILABLE AT [HTTPS://DOI.ORG/10.5281/zenodo.11374963](https://doi.org/10.5281/zenodo.11374963)

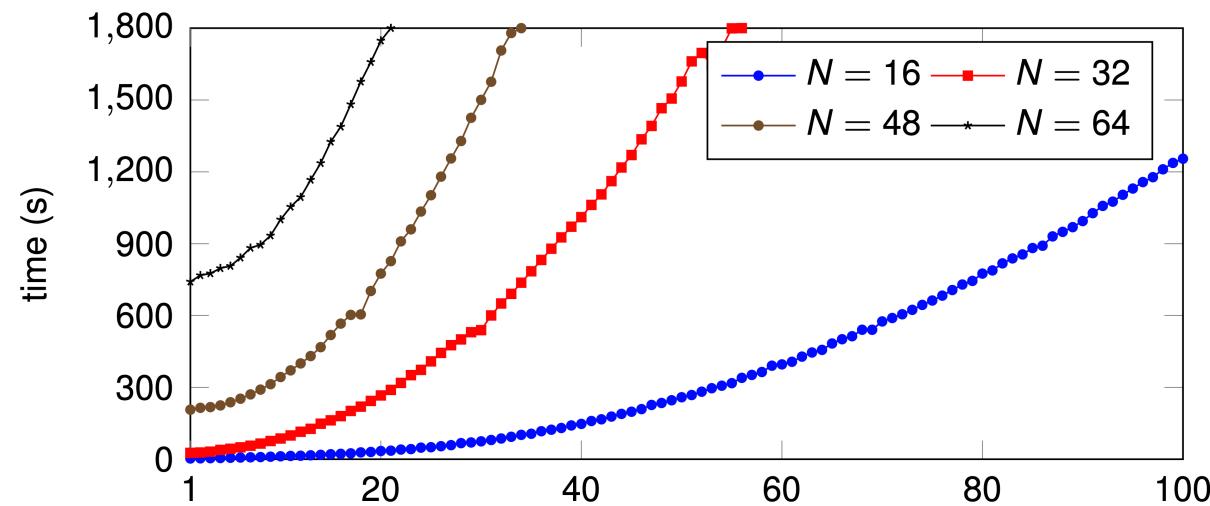
# Emergence of Synchronous Applause

- 1000 simulations, 192 steps each
- 58% synchronise before the end of the trace
- “Phase transition” around 128 time steps



# Stability of Synchronous Applause

- Can our agent break synchrony after reaching it?
- BMC, increasing bound, assuming audience in **synchrony** at time 0
- We stop at bound=100 or after timeout (30')
- No violations observed  $\Rightarrow$  **stable synchrony**



# Conclusion

- We presented a first attempt at formal modelling of a clapping audience
- Mix of simulation and verification to analyze its emergent behaviour
- Formal approach to CAS modelling has several benefits
  - High-level formalisms
  - Intuitive specifications
  - Access to efficient analysis techniques

... As pointed out by Rocco in countless occasions ☺

AbC, CARMA, DReAM, KLAIM, SCEL, ...  
(and LAbS!)

# Future Work

- Improve simulation performance
- Improve range of supported properties for verification
- Data-driven approaches
  - Given one or more traces of a system  $S$
  - Write a LAbS model  $M$
  - Does  $M$  allow (all, most, some) of the traces from  $S$ ?
- (Do you have interesting case studies? ☺)