## Digital Twins for Programmable Matter

#### Jakub Lengiewicz

team: P. Hołobut, P. Chodkiewicz, A. Górzyńska-Lengiewicz, A. Macios (IPPT PAN) in cooperation with: J. Bourgeois, B. Piranda (FEMTO-ST) S. Bordas (UniLu)







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Prediction of mechanical failures

Reconfiguration via porous flow

a movie...

- mechanical tasks
- digital & physical twin

## Motivation: molecular length scale

### Length-scale: $\sim 10^{-9} \text{m} - \sim 10^{-6} \text{m}$

• molecular machines, bio-molecular complexes, ...

• highly specialized, controlled by their structure and the basic laws of physics



Propulsion of flagella



Dynein "walking" along microtubule



ATP synthase complex in mitochondria

## Motivation: single-cell length scale

## Length-scale: $\sim 10^{-6} \text{m} - \sim 10^{-3} \text{m}$

- cells, microorganisms ...
- can move, co-operate, react to external stimuli, ...
- example *slime molds*:





## Motivation: complex-organism length scale

## Length-scale: $\sim 10^{-3}$ m – $\sim 10^{0}$ m

- organisms
- can move, co-operate, react to external stimuli, ...
- example fire ants:



## Motivation: synthetic systems $\rightarrow$ modular robotics

### Programmable Matter (PM) – definition

A class of <u>future meta-materials</u> which have the ability to freely and actively <u>change their shape</u> or other physical properties in a programmable and controllable manner.

<u>Hardware</u> – provides the ability to *perform physical actions* and *process information* at a very *fine length-scale*. <u>Software</u> – defines the *actual behavior* of the system, and *can be modified* if needed.



### Modular robotic approach



Miche (MIT)





ATRON (Univ. South. Denmark)

and many more

see [Yim et al., 2007]

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Luxembourg, 2019.09.11

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see [Yim et al., 2007] Luxembourg, 2019.09.11 7 / 30

## Modular robotic approach: main issues



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## Modular robotic approach: main issues



## Towards miniaturization – suitable hardware designs

## Spherical/cylindrical designs with no moving parts (catom)

[Kirby et al., IROS 2007], [Karagozler et al., IROS 2009], [Reid et al., NSTI Nanotech, 2008]



magnetic catom  $r\simeq 30mm$ 







spherical catom

### Electrostatic actuation mechanism

[M.E. Karagozler et al., proc. ISCAS, 2011]



Predictions for the spherical catom:

- radius  $r = 65 \mu m$
- max. lift  $f_{\rm max} \approx 1000~{\rm catoms}$
- mass m = 0.69 microgram
- max torque  $\, au_{
  m max} = 16 \, {
  m pNm}$

# What can we do with a large amount of modules?

### Collective actuation



### Our idea: weak&active vs. strong&static connections

weak & active

- is relatively weak
- can move w.r.t. neighbors
- can attach/detach
- existing prototypes: electromagnetic/electrostatic cylinders/spheres



weak & active

#### strong & static

- is much stronger
- is static (immobile)
- can attach/detach
- question how to realize this (e.g. self-soldering connections, Neubert et al., 2014)
- $\rightarrow\,$  Special evolving modular structures need to be designed



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### Our idea: weak&active vs. strong&static connections



weak (propelling) connection [red & yellow] strong (fixed) connection [gray & blue]





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### Organization of information exchange and processing

- modular robot is an asynchronous distributed computing architecture – MIMD (multiple instruction, multiple data)
- independent CPU and memory is located in every module
- communication with direct neighbors
- possibility to reconfigure



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#### $\rightarrow\,$ special distributed algorithms need to be developed



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3 Reconfiguration via porous flow

## Possible reconfiguration failures - problem statement

## Safe reconfiguration scenario



### Mechanical failures during reconfiguration



[P. Hołobut and J. Lengiewicz, Distributed computation of forces in modular-robotic ensembles as part of reconfigur. planning, *Proceedings of the IEEE International Conference on Robotics and Automation*, **2017**]

## Mechanical problem to be solved



Figure: Initial  $\Omega$ , loaded  $\omega$  and perturbed  $\overline{\omega}$  configurations • modular robot  $\longrightarrow$  simplified frame model of modular structure

$$\boldsymbol{K}_{pq}^{11} = \frac{E}{L^3} \begin{pmatrix} AL^2 & 0 & 0\\ 0 & 12I & 6IL\\ 0 & 6IL & 4IL^2 \end{pmatrix}, \qquad \boldsymbol{K}_{pq}^{12} = \frac{E}{L^3} \begin{pmatrix} -AL^2 & 0 & 0\\ 0 & -12I & 6IL\\ 0 & -6IL & 2IL^2 \end{pmatrix},$$

 $\bullet\,$  assembled system of equations for deformed configuration  $\omega$ 

$$K \boldsymbol{u} = F$$

• assembled system of eqs. for perturbed (to be predicted) configuration  $\bar{\omega}$ 

$$\bar{K}(\boldsymbol{u} + \Delta \bar{\boldsymbol{u}}) = \bar{F},$$

### Weighted Jacobi iterative scheme

 $\bar{K}(u + \Delta \bar{u}) = \bar{F}$ 

- calculations performed by the distributed system itself
- weighted Jacobi's (iterative) distributed solution scheme to predict deformation and forces for a desired reconfiguration step
- iteration i + 1 for the module p (with its neighbors q):

$$\Delta \bar{\boldsymbol{u}}_p^{i+1} = \frac{2}{3} \bar{\boldsymbol{D}}_p^{-1} \left( \bar{\boldsymbol{F}}_p - \bar{\boldsymbol{f}}_p - \bar{\boldsymbol{R}}_p \Delta \bar{\boldsymbol{u}}_p^i - \sum_q \bar{\boldsymbol{K}}_{pq}^{12} \Delta \bar{\boldsymbol{u}}_q^i \right) + \frac{1}{3} \Delta \bar{\boldsymbol{u}}_p^i,$$

where diagonal and remainder parts of K read

$$ar{D}_p = ext{diag}\left(\sum_q ar{K}_{pq}^{11}
ight) \quad ext{and} \quad ar{R}_p = \left(\sum_q ar{K}_{pq}^{11}
ight) - ar{D}_p$$

• the scheme only relies on local information from neighbours at each iteration

## Two basic examples

### Examples

- four connections are planned to be released
- three configurations: undeformed, deformed and predicted



## Results

axial/shear/bending stresses can be predicted



Example 1 (axial forces)

Example 2 (axial forces)

- reconfiguration planner now can decide if the predicted forces are acceptable
- Success!

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## Problems...

### Time complexity



- CPU time scales poorly with increasing system size improvements needed
- weighted-Jacobi scheme is only conditionally convergent
- distributed solution schemes of computational mechanics can be adapted
  - $\rightarrow$  multigrid methods
  - $\rightarrow$  multi-scale modeling (coarsening)

## Implementation on the Blinky Blocks modular robot



#### proof-of-concept

- cooperation with the group of Prof. J. Bourgeois, femto-st/University of Franche-Comté (France)
- cubic topology, magnetic connection, message passing, visualization with colors
- individual connection strength identified experimentally
- our algorithm is run on a robot + experimental validation of results

[7] B. Piranda, P. Chodkiewicz, P. Hołobut, S. Bordas, J. Bourgeois and J. Lengiewicz, Distributed autonomous detection of mechanically unsafe reconfiguration scenarios, *work in progress*.

## Informal consortium: IPPT PAN - Uni.Lu - femto-st et Al.





Prediction of mechanical failures



## Problem of pure shape change & locomotion



#### assumptions:

- system under external load (e.g. gravity)
- mobile (active) connections are weak (may be locked beneath the surface)
- CPU time << communication time << module physical motion time

#### aim:

- perform reconfiguration from initial to a desired shape
- minimize overall reconfiguration time

## Possible approaches to reconfiguration



#### usual approach:

- translation of the surface modules only (e.g., Bourgeois et al., 2016)
- drawback: relatively high overall reconfiguration time

#### our approach:

- maintain a porous frame structure and engage a volume of modules to move
- expected improved overall reconfiguration time

[6] J. Lengiewicz and P. Hołobut, Efficient Collective Shape Shifting and Locomotion of Massively-Modular Robotic Structures, *Autonomous Robots*, *DOI:* 10.1007/s10514-018-9709-6.

Elementary moves and porous structure made of meta-modules







### volumetric flow and outflow/inflow through the surface







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Elementary moves and porous structure made of meta-modules







## volumetric flow and outflow/inflow through the surface







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### Flow as a graph (meta-module as a graph vertex)



- reconfiguration step as a flow through a porous structure
- problem to find a maximum set of disjoint streamlines
- $\rightarrow\,$  integral max-flow problem with unit vertex capacity to be solved
- $\rightarrow\,$  distributed algorithm run by the modular robot itself needs to be used

- multi-step procedure
- time lapse 4x



step 04:

- multi-step procedure
- time lapse 4x



step 08:

- multi-step procedure
- time lapse 4x



step 12:

- multi-step procedure
- time lapse 4x



step 16:

- multi-step procedure
- time lapse 4x



step 20:

- multi-step procedure
- time lapse 4x



step 24:

- multi-step procedure
- time lapse 4x



step 28:

- multi-step procedure
- time lapse 4x



step 32:

- multi-step procedure
- time lapse 4x



step 36:

- multi-step procedure
- time lapse 4x



- multi-step procedure
- time lapse 4x



step 44:

# CPU/time/memory complexity assessments



Figure: Three different resolutions k of the same geometry

Table: Assessed complexities for the increasing resolution k in p dimensions.

	pure algorithm	algorithm with heuristics
N.of steps	$\sim k$	$\sim k$
Avg. iterations/step	$\sim k^p$	$\sim k^{p-1}$
Avg. CPU/step	$\sim k^{2p-1}$	$\sim k^{2p-2}$
Avg. CPU/step/module	$\sim k^{p-1}$	$\sim k^{p-2}$
Max. memory/module	$\sim k^{p-1}$	$\sim k^{p-1}$

• N.of steps scales favorably but CPU time may be a bottleneck.

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[1] P. Hołobut, M. Kursa, and J. Lengiewicz, A class of microstructures for scalable collective actuation of Programmable Matter, *Proceedings of the IEEE/RSJ International Conference on Intelligent Robots and Systems* **2014**.

[2] P. Hołobut, M. Kursa, and J. Lengiewicz, Efficient modular-robotic structures to increase force-to-weight ratio of scalable collective actuators, *Proceedings of the IEEE/RSJ International Conference on Intelligent Robots and Systems* **2015**.

[3] P. Hołobut, P. Chodkiewicz, A. Macios, and J. Lengiewicz, Internal localization algorithm based on relative positions for cubic-lattice modular-robotic ensembles, Proceedings of the IEEE/RSJ International Conference on Intelligent Robots and Systems 2016.

[4] P. Hołobut and J. Lengiewicz, Distributed computation of forces in modular-robotic ensembles as part of reconfiguration planning, *Proceedings of the IEEE International Conference on Robotics and Automation* **2017** 

[5] J. Lengiewicz, M. Kursa, and P. Hołobut, Modular-Robotic Structures for Scalable Collective Actuation, *Robotica*, **2017**.

[6] J. Lengiewicz and P. Hołobut, Efficient Collective Shape Shifting and Locomotion of Massively-Modular Robotic Structures, *Autonomous Robots*, **2019**.

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