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Soft Robotic Modeling and Control: Bringing Together  
Articulated Soft Robots and Soft-Bodied Robots



# Soft robot bodies: a control challenge or a solution for robot control?

Cecilia Laschi, Marcello Calisti

The BioRobotics Institute, Scuola Superiore Sant'Anna, Pisa, Italy

IROS 2018, Madrid - October 5, 2018



# Abilities not yet reached by robots



Lessons from Nature

# Bioinspiration and biomimetics

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Too complex?  
Rather too simple?



# Embodied Intelligence & Morphological Computation

## Classical approach

The focus is on the brain and central processing

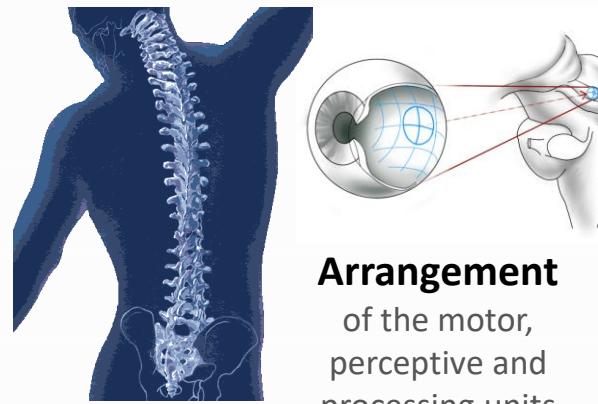


## Modern approach

The focus is on interaction with the environment. Cognition is emergent from system-environment interaction

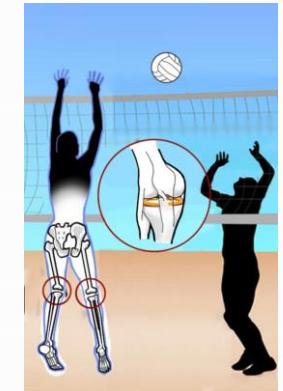


As any transformation of information can be named as *computing*, *Morphological Computation* endows all those behaviours where computing is mediated by the mechanical properties of the physical body



**Arrangement**  
of the motor,  
perceptive and  
processing units

**Shape**  
as body structure, specifies the  
behavioral response of the agent



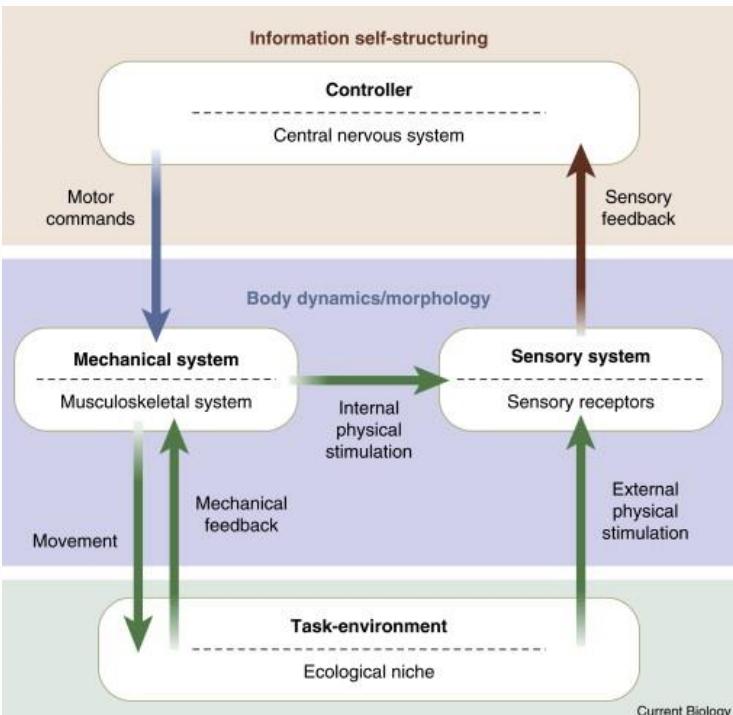
**Mechanical properties**  
allow emergent behaviors  
and adaptive interaction  
with the environment

Rolf Pfeifer and Josh C. Bongard, *How the body shapes the way we think: a new view of intelligence*, The MIT Press, Cambridge, MA, 2007

Zambrano D, Cianchetti M, Laschi C (2014) "The Morphological Computation Principles as a New Paradigm for Robotic Design" in *Opinions and Outlooks on Morphological Computation*, H. Hauser, R. M. Füchslin, R. Pfeifer (Ed.s), pp. 214-225.

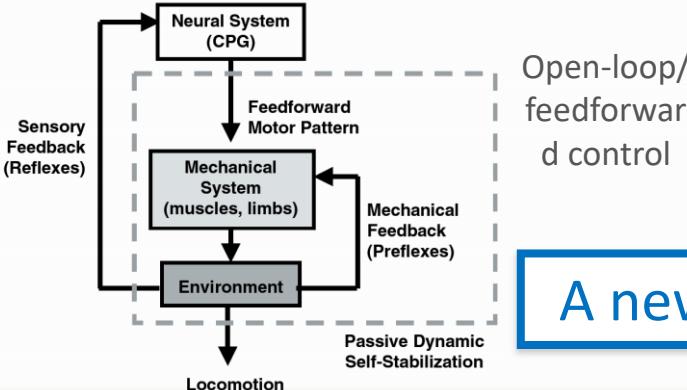
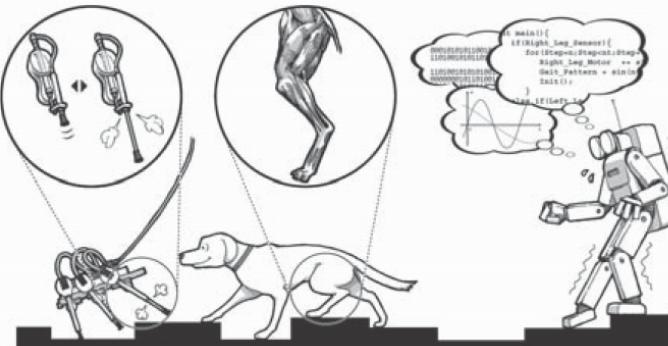


# Embodied Intelligence & Morphological Computation



Rolf Pfeifer and Josh C. Bongard, *How the body shapes the way we think: a new view of intelligence*, The MIT Press, Cambridge, MA, 2007

Many tasks become much easier if morphological computation is taken into account.



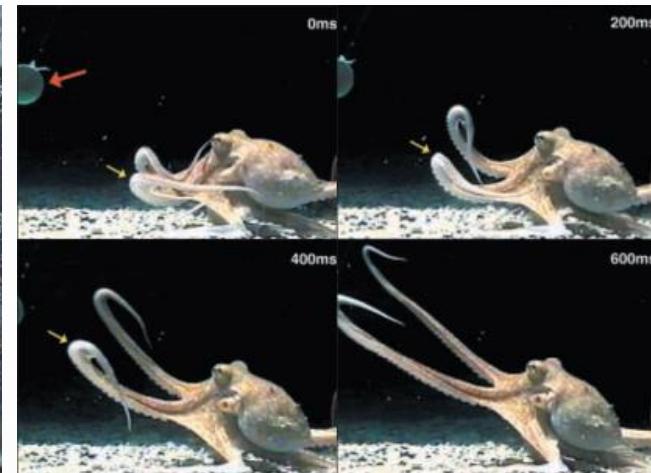
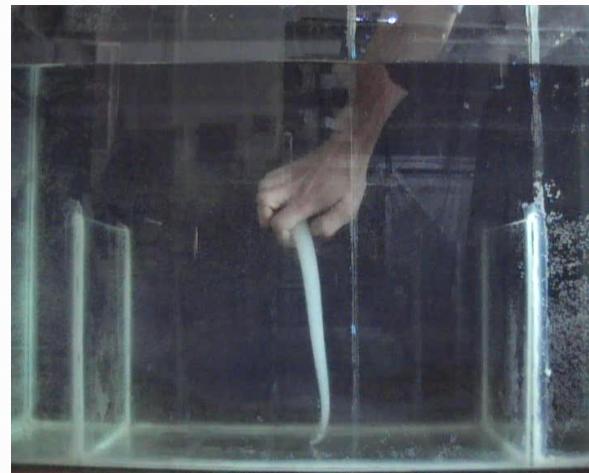
A new soft bodyware

JG Cham, SA Bailey, JE Clark, RJ Full and MR Cutkosky (2002). "Fast and Robust: Hexapedal Robots via Shape Deposition Manufacturing" *The International Journal of Robotics Research*, 21: 869



## Simplifying principles in reaching

# The octopus arm embodied intelligence



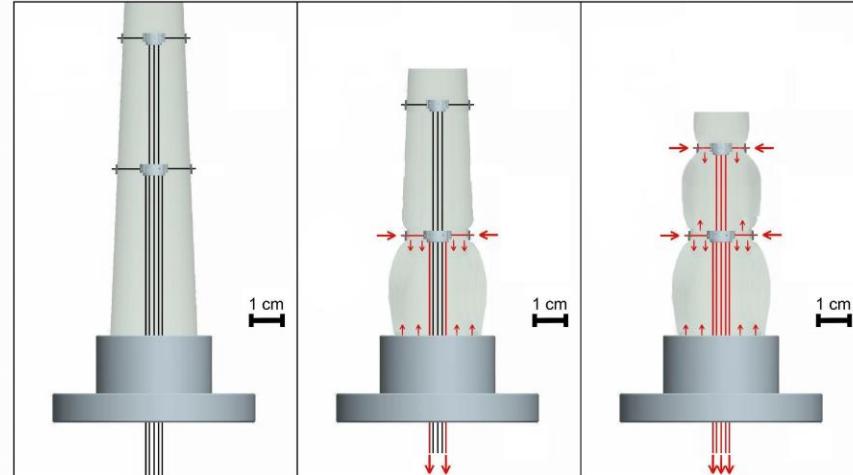
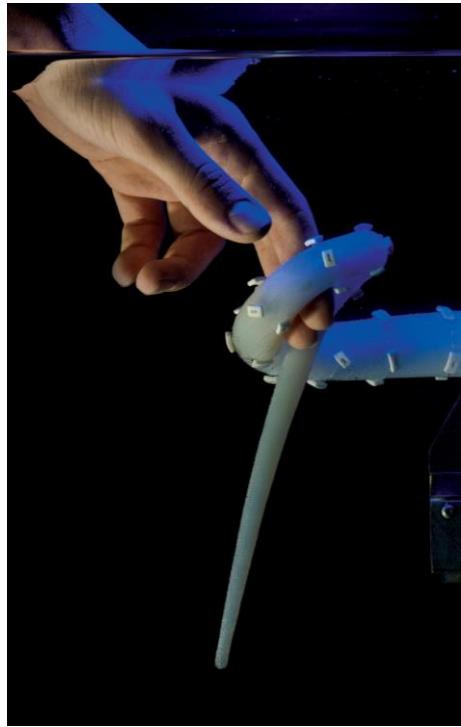
- stiffening wave from base to distal part, that can start from any part of the arm;
- movement executed in about 1 second, velocities in the range of 20–60 cm/s;
- control divided between central and peripheral: from brain: **3 parameters** (yaw and pitch of arm base and peak velocity of bend-point); locally: propagation of stiffness

I. Zelman, M. Galun, A. Akselrod-Ballin, Y. Yekutieli, B. Hochner, and T. Flash (2009) Nearly automatic motion capture system for tracking octopus arm movements in 3D space, *Journal of Neuroscience Methods*, Volume 182: 97-109

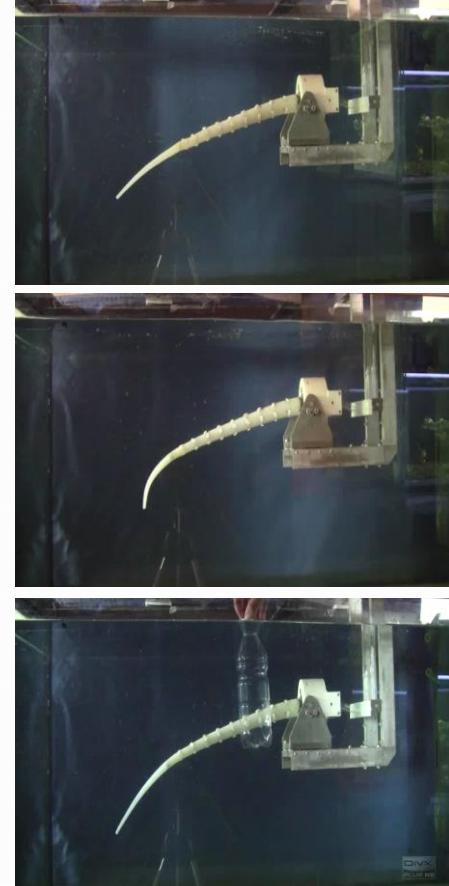
L. Zullo, G. Sumbre, C. Agnisola, T. Flash, B. Hochner (2009) Nonsomatotopic Organization of the Higher Motor Centers in Octopus, *Current Biology*, 19:1632-1636.



# Simplifying principles in reaching



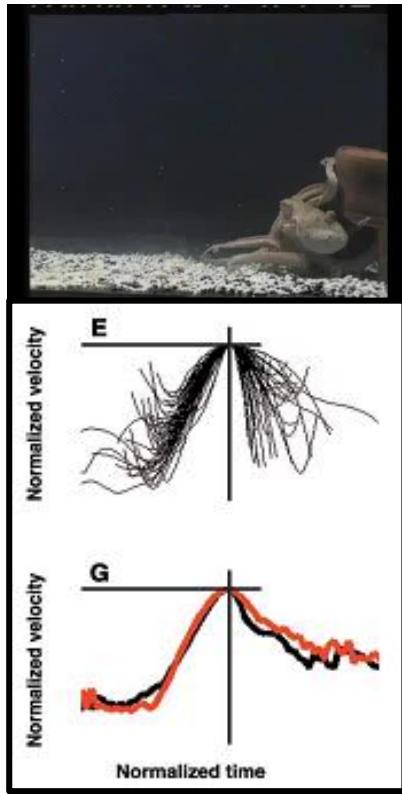
- Silicone
- 9 sections of transverse and longitudinal cables (coupled)
- Simple activation pattern: sequential activation of sections, with equal activation of 4 longi-transverse cables per section



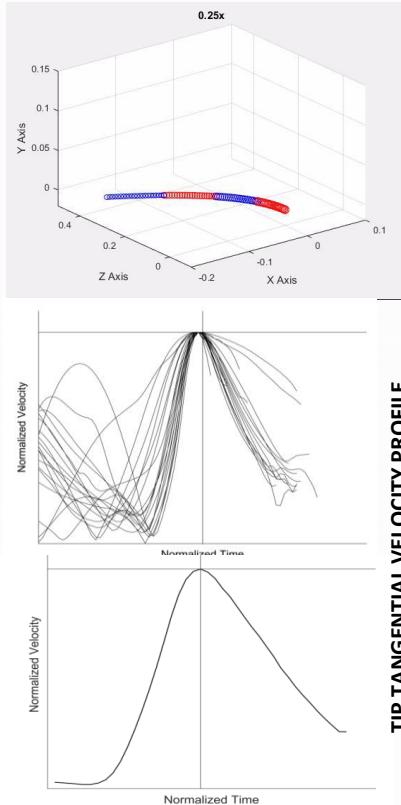
Cianchetti, M., Arienti, A., Follador, M., Mazzolai, B., Dario, P., Laschi, C. "Design concept and validation of a robotic arm inspired by the octopus", *Materials Science and Engineering C*, Vol.31, 2011, pp.1230-1239.



# Biological behaviour



# Robot behaviour



**morphological and environmental properties** are the factors that affects the invariant velocity profile observed

- Soft robot
- Passive distal part
- Water
- Neural controller (not octopus-like)

## Environmental properties

Configuration	Learnable	Bend Propagation Strategy
Lower Environment Density (air)	No	N/A
Lower Environment Density (air) + Higher Body Stiffness and Viscosity	Yes	No
Actuators at Tip (4th Section)	No	N/A
Actuators at 3rd Section	Yes	No
Only two actuators at the base	Yes	Yes
Three Actuators at base + One at the tip	Yes	Yes
Shorter Manipulator (Only two sections)	Yes	No
Cylindrical Shape	No	N/A
Double module experiment	Yes	Two

## Morphological properties

Sumbre, G., Gutfreund, Y., Fiorito, G., Flash, T., & Hochner, B. (2001). "Control of octopus arm extension by a peripheral motor program", *Science*, 293(5536), 1845-1848.

T. George Thuruthel, Falotico E., Renda F., Flash T., Laschi C., "Emergence of Behavior through Morphology: A Case study on an Octopus Inspired Manipulator", *Bioinspiration and Biomimetics*, under review.

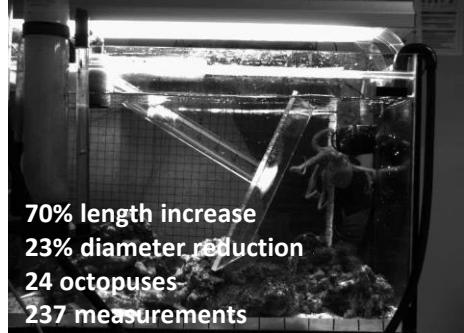


# Simplifying principles in elongation and stiffening

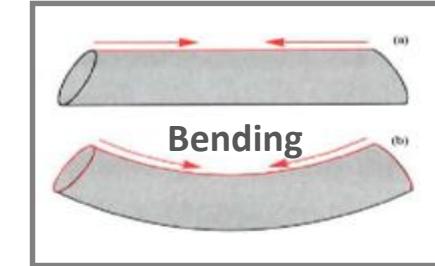
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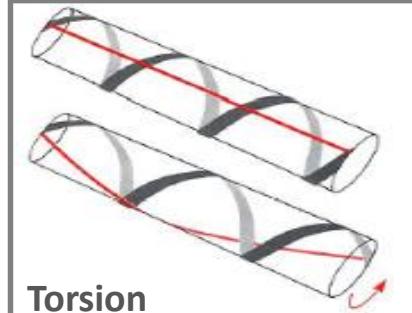
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## The octopus arm muscular hydrostat



Stiffening (co-contractions)



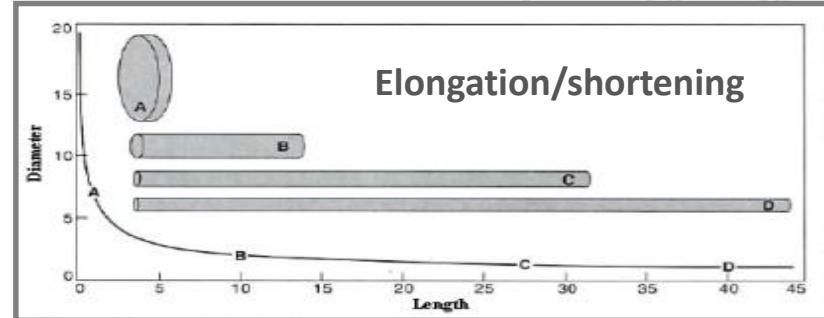
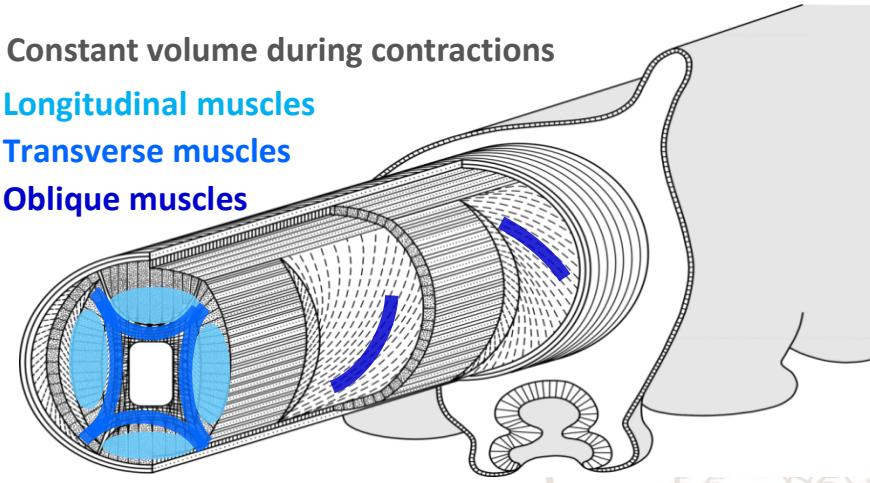
Torsion

Constant volume during contractions

Longitudinal muscles

Transverse muscles

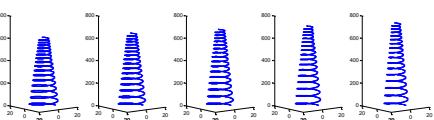
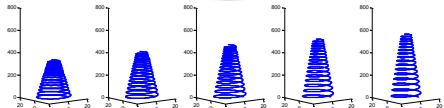
Oblique muscles



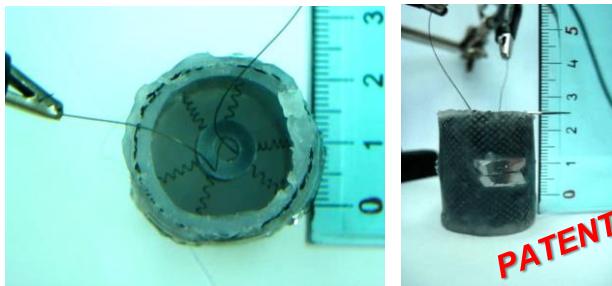
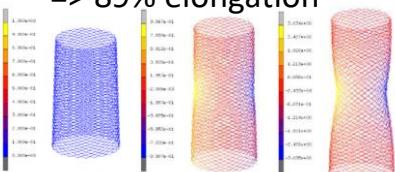
Muscular structure working as a modifiable skeleton

Kier W. "The arrangement and function of Molluscan muscle", *The Mollusca*, Vol. II, 1988

# Simplifying principles in elongation and stiffening Octopus-like muscular hydrostat



20% diameter reduction  
=> 89% elongation



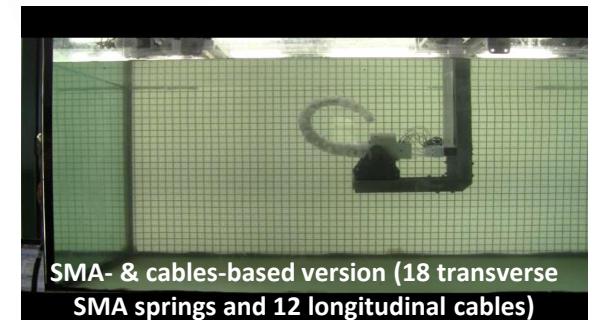
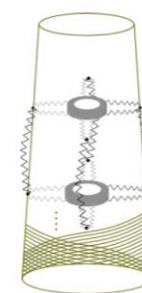
1 second of 600 mA direct current and then 50% duty cycle pulse current

6 SMA springs:

- 0.2 mm Flexinol® wire diameter
- $\langle D \rangle / d = 6$  (cycle life parameter)
- Spring internal diameter = 1 mm

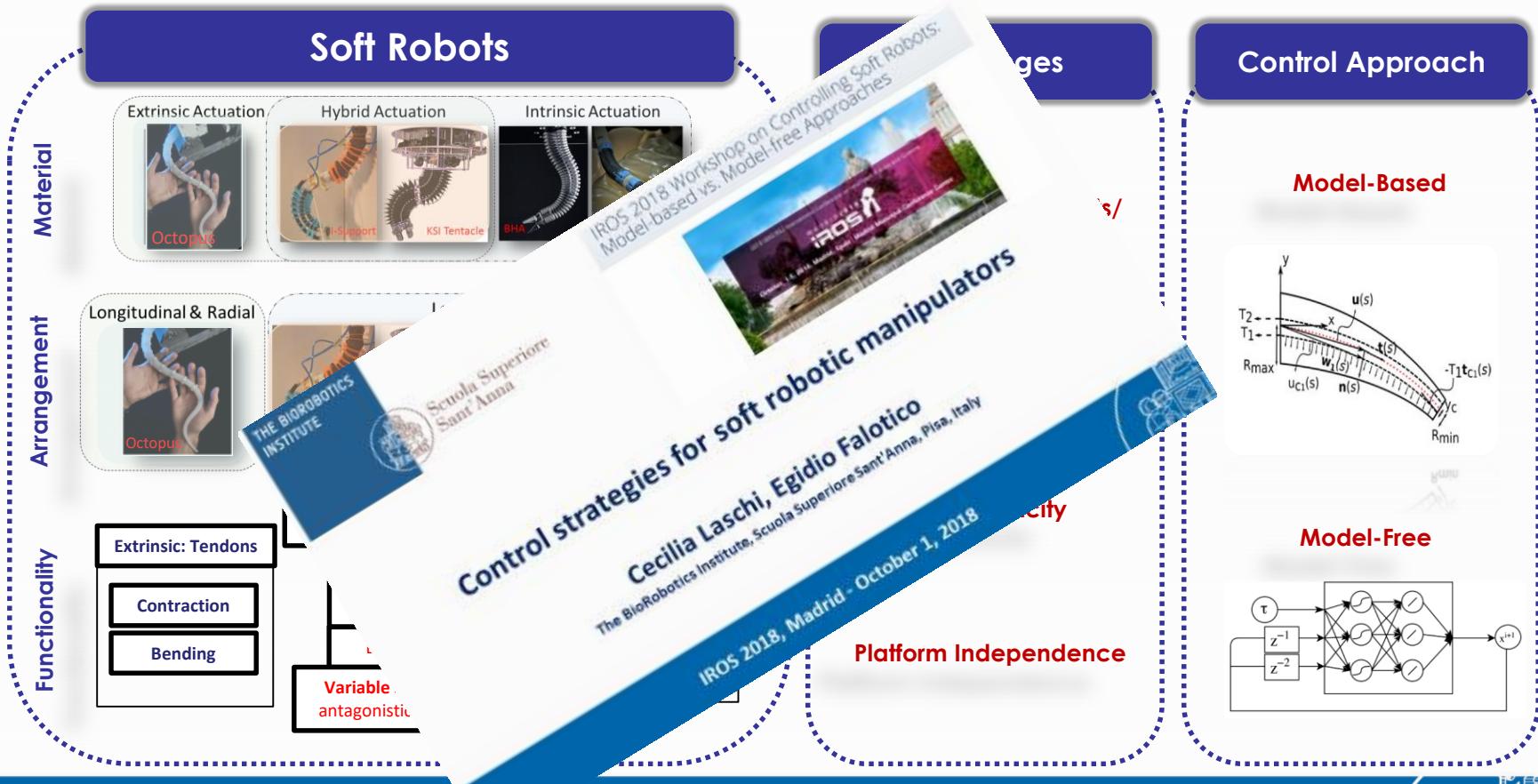
Silicone / braided sleeve:

- External diameter = 28mm
- Internal diameter = 20mm



SMA- & cables-based version (18 transverse SMA springs and 12 longitudinal cables)

# Approaches for control of soft robots



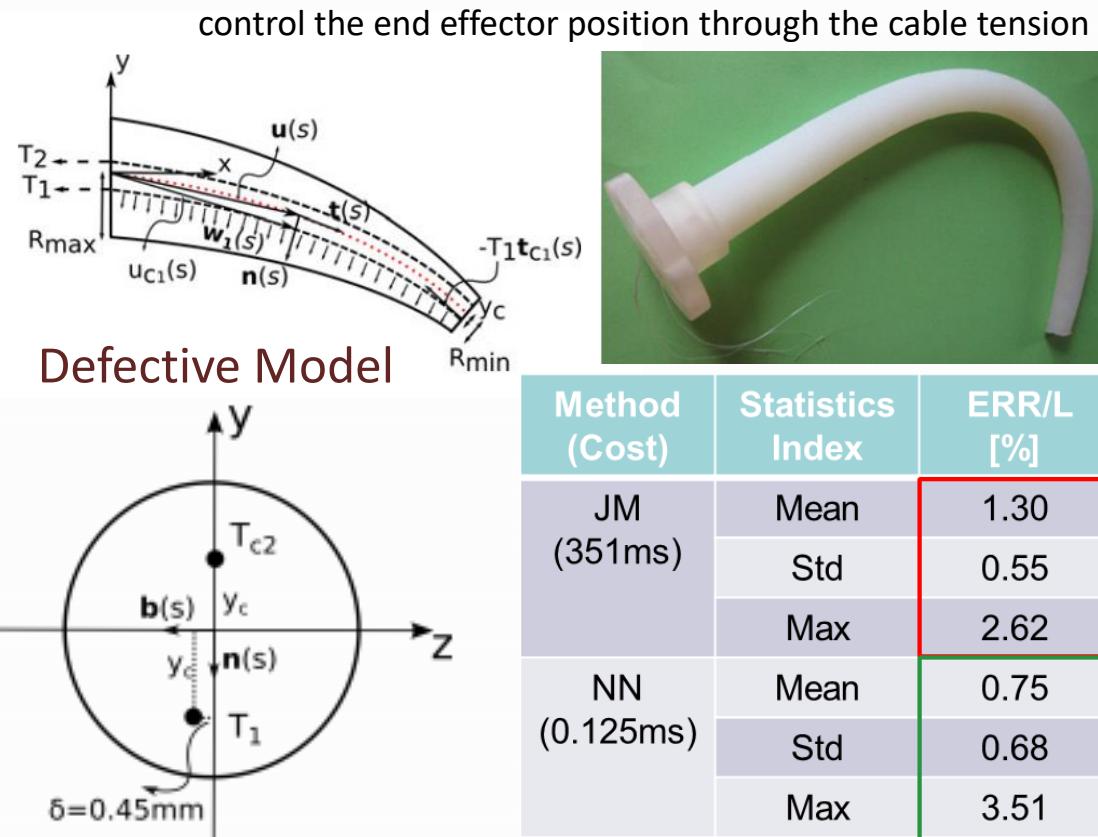
T. George Thuruthel, Y. Ansari, E. Falotico, C. Laschi (2018) "Control Strategies for soft robotic manipulators: a survey", *Soft Robotics* 5(2)

# Comparison of model-based and model-free approaches

1. Jacobian-based Inverse Static Controller
2. Learning-based Control, by learning the inverse model.

Learning by collecting points and exploiting the approximation capability of a FNN, as for rigid robots

Method (Cost)	Statistics Index	ERR/L [%]
JM (351ms)	Mean	0.27
	Std	0.03
	Max	0.32
NN (0.125ms)	Mean	0.73
	Std	0.55
	Max	3.1



Giorelli, M., Renda, F., Calisti, M., Arienti, A., Ferri, G., & Laschi, C. (2015). Neural network and Jacobian method for solving the inverse statics of a cable-driven soft arm with nonconstant curvature. *IEEE Transactions on Robotics*, 31(4), 823-834.



# Self-Stabilizing Trajectories



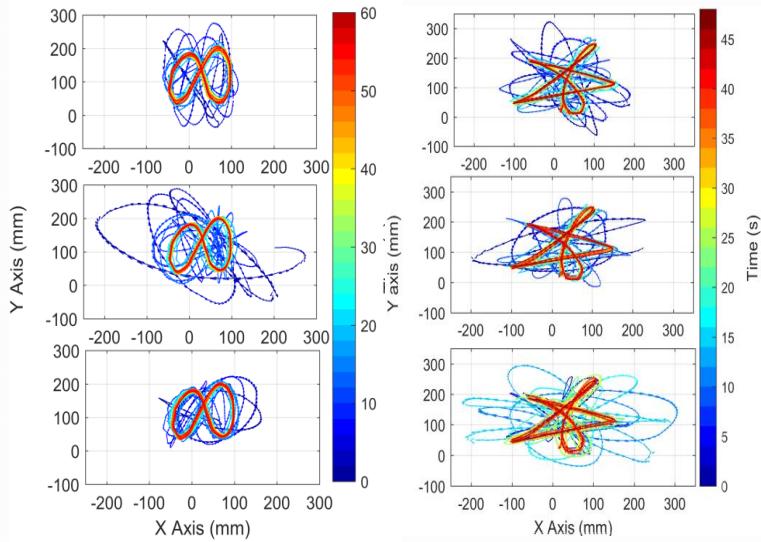
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## Stable Open Loop Control of Soft Robotic Manipulators

Thomas George Thuruthel, Egidio Falotico, Mariangela Manti and Cecilia Laschi, Senior Member, IEEE



The unique dynamics of a soft manipulator exhibits larger number of dynamic attractors that can be used for stable open loop control



The stable trajectories can be observed using the learned forward model

Thuruthel T. G., Falotico E., Manti M., Laschi C. (2018). Stable Open Loop Control of Soft Robotic Manipulators. *IEEE Robotics and Automation Letters*, 3(2), 1292-1298.



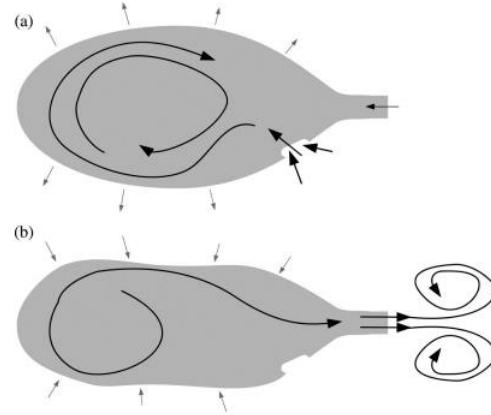
# Simplifying principles in swimming

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## Pulsed-jet swimming in cephalopods

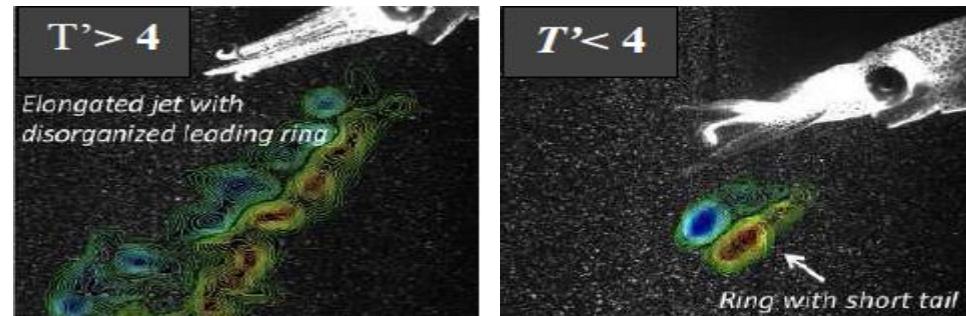


### REFILL PHASE

- mantle expansion
- refilling of the mantle cavity through water inlets

### JET PHASE

- mantle contraction
- expulsion of a fluid slug through the funnel (siphon)



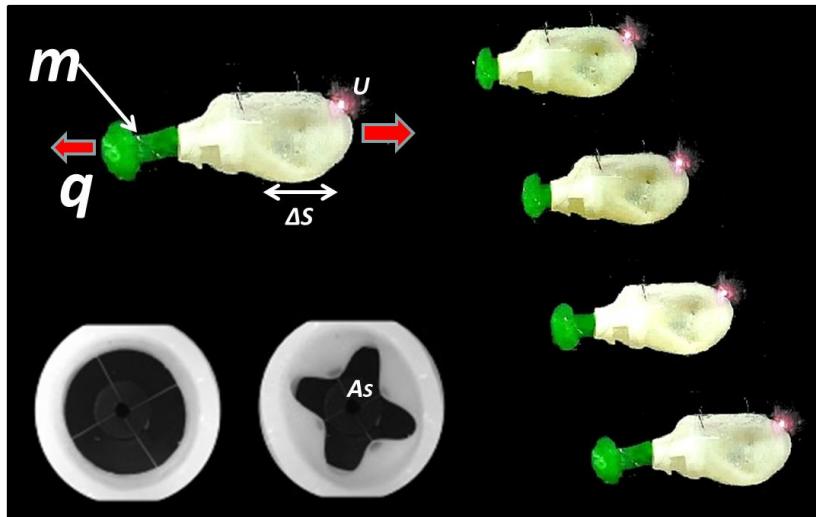
Ejection of a discontinuous stream of fluid through a nozzle that produces **ring vortices**.

The generation of ring vortices provides an additional thrust to the one generated by a continuous jet, by generating an additional pressure at the nozzle orifice

The mantle and siphon **morphology** and the pulsed jet **frequency** optimize propulsion, producing **ring vortices**

# Simplifying principles in swimming

## Pulsed-jet swimming soft robot



Silicone and cables, 1 DOF



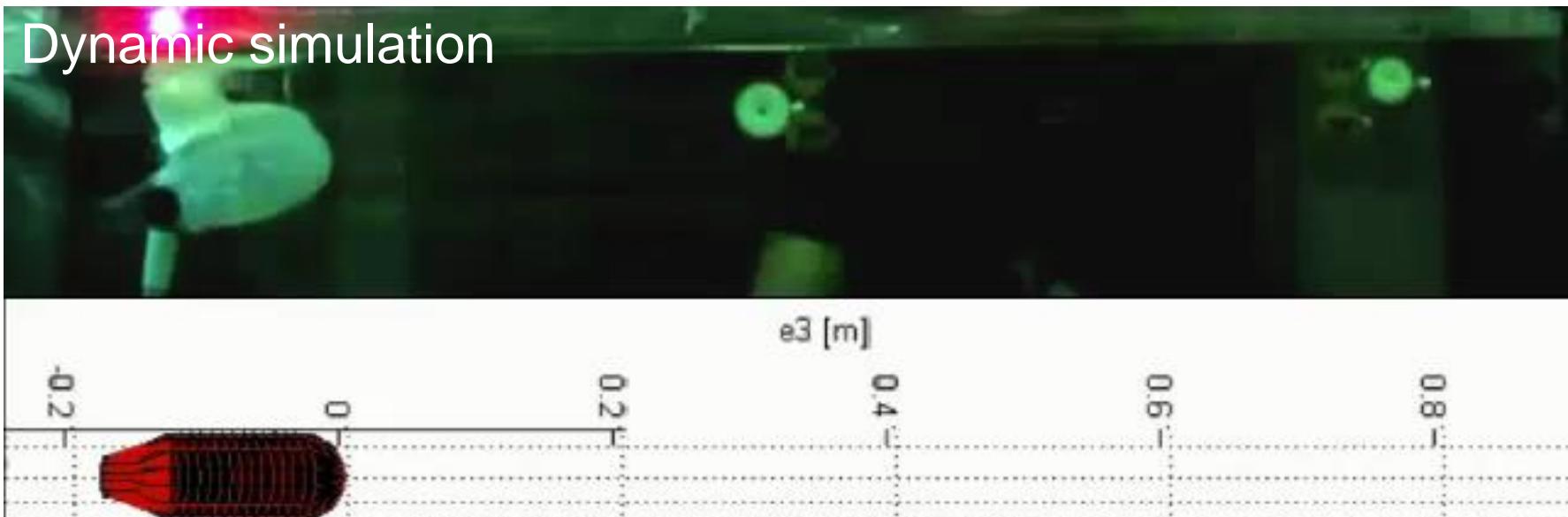
PoseiDrone

The mantle and siphon **morphology** and the pulsed jet **frequency** optimize propulsion, producing ring vortexes (in green)



# Pulsed-jet swimming soft robot

Dynamic simulation



The external loads considered are: gravity, buoyancy, added mass, drag load (coming from the interaction with the fluid) and cable load (input)

Renda F., Giorgio Serchi F., Boyer F. and Laschi C. (2015), "Modelling Cephalopod-inspired pulsed-jet locomotion for underwater soft robots", Bioinspiration & Biomimetics, (10), 055005, doi:10.1088/1748-3190/10/5/055005.

Renda F., Giorgio Serchi F., Boyer F. and Laschi C. (2015), "Structural Dynamics of a Pulsed-Jet Propulsion System for Underwater Soft Robot", International Journal of Advanced Robotics System, 12:68, 2015, doi: 10.5772/60143.

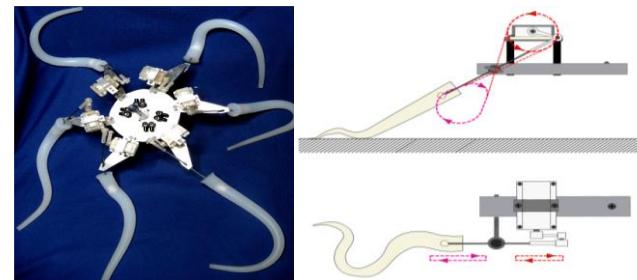


# Simplifying principles in underwater locomotion

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(c)

(b)

(a) Nylon cables for grasping

(b) Flexible steel cable

(c) Silicone cone

## Octopus crawling



Octopus recorded through a transparent bottom and a mirror. Locomotion is based on **cyclic** control of **two** back arms, while the body is raised thanks to **neutral buoyance**. Locomotion consists of 4 phases:

1. Arm shortening
2. Attaching to the floor
3. Elongation (pushing the body forward)
4. Detaching

Calisti, M. Giorelli, G. Levy, B. Mazzolai, B. Hochner, C. Laschi, P. Dario, "An octopus-bioinspired solution to movement and manipulation for soft robots", *Bioinspiration and Biomimetics* Vol.6, No.3, 2011, 10 pp.

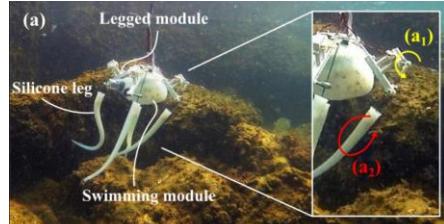
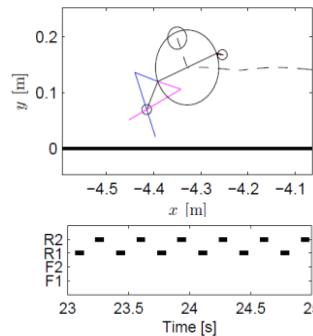
Calisti, M., Corucci, F., Arienti, A., & Laschi, C. (2015). Dynamics of underwater legged locomotion: modeling and experiments on an octopus-inspired robot. *Bioinspiration & biomimetics*, 10(4), 046012.

# Evolutionary algorithms to design soft bodies with underwater self-stabilized locomotion

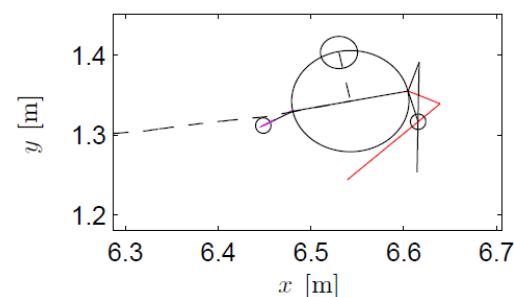
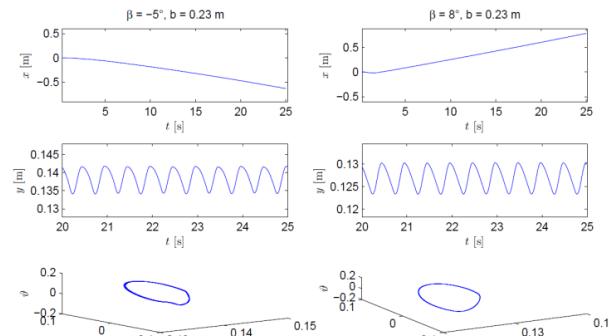
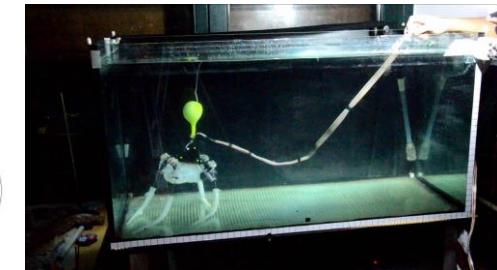
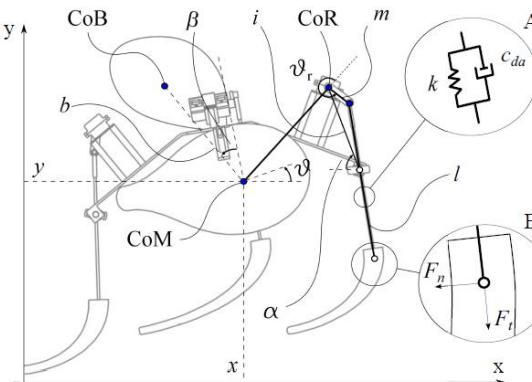
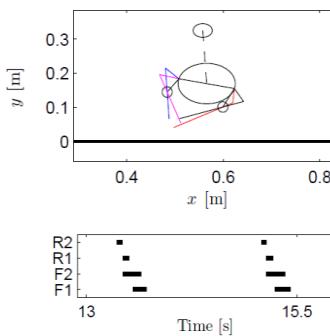
How to design the morphology of a soft robot with octopus-like pushing-based locomotion strategy?



Resulting octopus-like two-pushing leg strategy



Novel quadruped strategy, with long flight phases



Calisti M., Corucci F., Arienti A., Laschi C. 2015. "Dynamics of underwater legged locomotion: Modeling and experiments on an octopus-inspired robot", *Bioinspiration & Biomimetics* 10(1)..

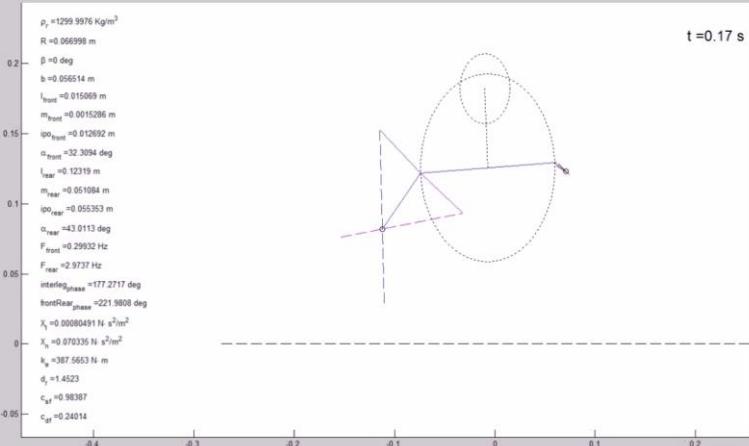
F. Corucci, M. Calisti, H. Hauser, C. Laschi "Shaping the body to shape the behavior: a more active role of the morphology in the brain-body trade-off", 13th European Conference on Artificial Life (ECAL 2015) in York, United Kingdom, 20-24 July 2015

F. Corucci, M. Calisti, H. Hauser, C. Laschi, "Evolutionary discovery of self-stabilized dynamic gaits for a soft underwater legged robot", ICAR2015, July 27-31, Istanbul, Turkey

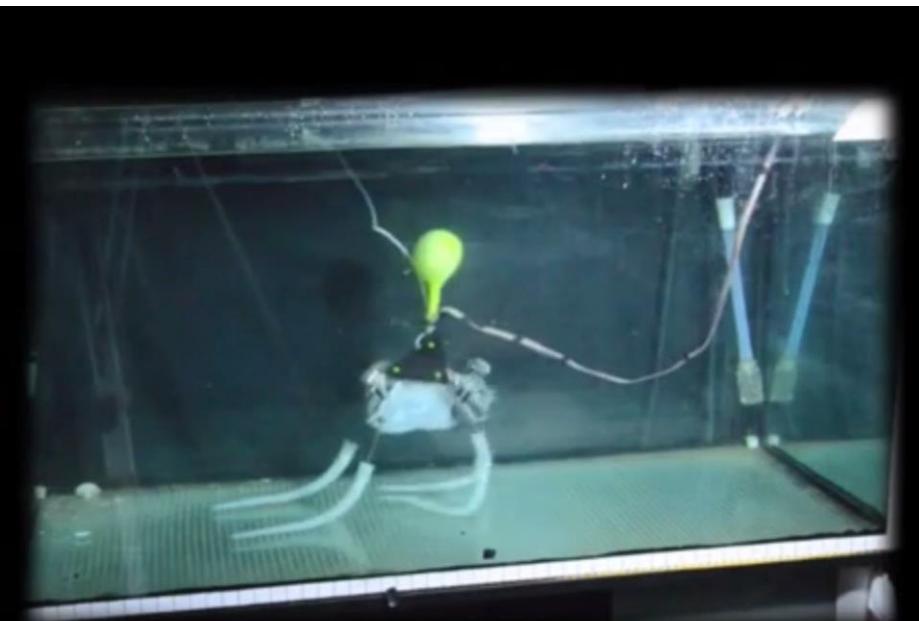
F. Corucci, M. Calisti, H. Hauser, C. Laschi, "Novelty-based evolutionary design of morphing underwater robots", Genetic and Evolutionary Computation Conference (GECCO), July 11-15 2015, Madrid, Spain

# Evolutionary algorithms to design soft bodies with underwater self-stabilized locomotion

0.25x



Fast bipedal backward runner



Calisti M., Corucci F., Arienti A., Laschi C. 2015. "Dynamics of underwater legged locomotion: Modeling and experiments on an octopus-inspired robot", *Bioinspiration & Biomimetics* 10(1)..

F. Corucci, M. Calisti, H. Hauser, C. Laschi "Shaping the body to shape the behavior: a more active role of the morphology in the brain-body trade-off", 13th European Conference on Artificial Life (ECAL 2015) in York, United Kingdom, 20-24 July 2015

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F. Corucci, M. Calisti, H. Hauser, C. Laschi, "Novelty-based evolutionary design of morphing underwater robots", Genetic and Evolutionary Computation Conference (GECCO), July 11-15 2015, Madrid, Spain



PoseiDRONE: a soft underwater robot

# Simplifying principles in underwater locomotion

## U-SLIP model

Body matters: compliant legs or a soft body directly influence stability and speed

Water drag, added mass, buoyancy and pushing propulsion have been added to the SLIP model

$$\ddot{x} = -\frac{X}{(m+M)} \dot{x} |\dot{x}| + \frac{k(\tilde{x} - x_t)}{m+M} \left( \frac{(r_0 + \tilde{r}) - \tilde{l}}{\tilde{l}} \right)$$

$$\ddot{y} = -\frac{Y}{(m+M)} \dot{y} |\dot{y}| + \underbrace{\frac{k\tilde{y}}{m+M} \left( \frac{(r_0 + \tilde{r}) - \tilde{l}}{\tilde{l}} \right) - \frac{mg}{m+M} + \frac{\rho_w V g}{m+M}}$$

null during swimming

Swimming to punting condition:  $\tilde{y} = r_0 \sin \alpha$

Punting to swimming condition: Spring at rest length

Dimensionless equations

$$\ddot{x} = -A\dot{x}|\dot{x}| + D \left( x - \frac{x_t}{r_0} \right) \left( \frac{1+r}{l} - 1 \right) \quad r = r_s t$$

$$\ddot{y} = -B\dot{y}|\dot{y}| + Dy \left( \frac{1+r}{l} - 1 \right) - C \quad y = r_0 \sin \alpha$$

With:

$$A = Xr_0/(m+M)$$

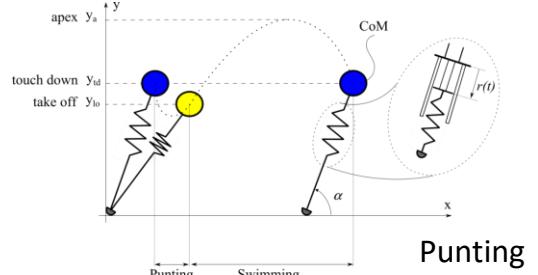
$$B = Yr_0/(m+M)$$

$$C = (m - \rho_w V)/(m+M)$$

$$D = kr_0/(mg + Mg)$$

2 control parameters

4 design parameters

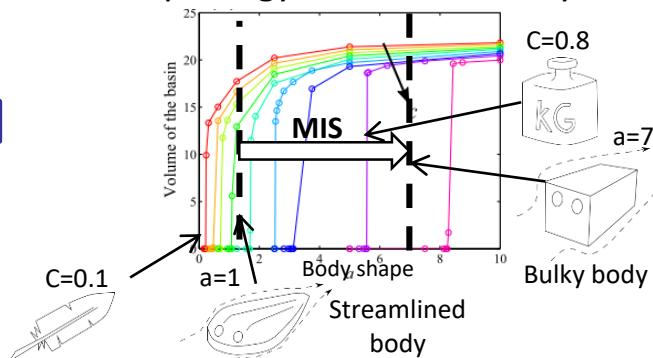


Punting gait model

Underwater hopping (bouncing) like a monopode



### Morphology-Induced Stability



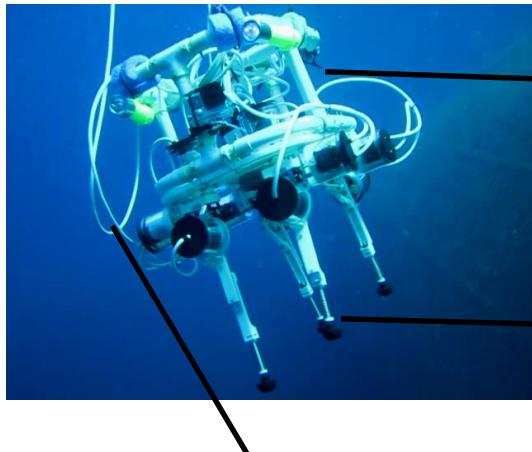
Calisti, M., and C. Laschi. "Underwater running on uneven terrain." *IEEE OCEANS 2015*, Genova.

Calisti, M., E. Falotico, and C. Laschi. "Hopping on uneven terrains with an underwater one-legged robot." *IEEE Robotics and Automation Letters* 1.1 (2016): 461-468.

Calisti, M., G. Picardi, and C. Laschi. "Fundamentals of soft robot locomotion." *Journal of The Royal Society Interface* 14.130 (2017): 20170101.

# Seabed Interaction Legged Vehicle for Exploration and Research (SILVER)

Innovative underwater robot intended to become a common tool when accurate exploration, monitoring, and interaction with the benthic environment is required.

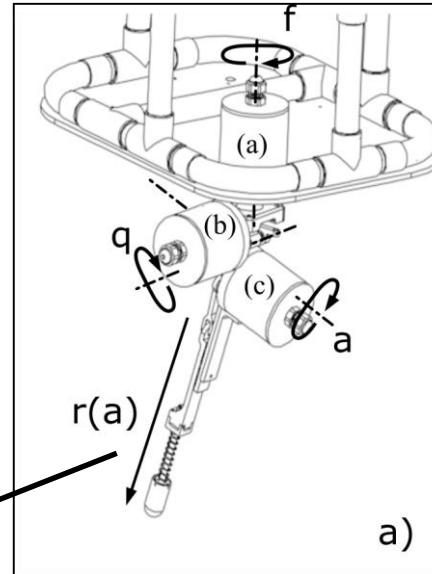


Open frame structure

Four legs with 3 DOFs.  
Two rotational DOFs ( $f, q$ ) and one prismatic DOF ( $r$ )

Remotely operated via a tether

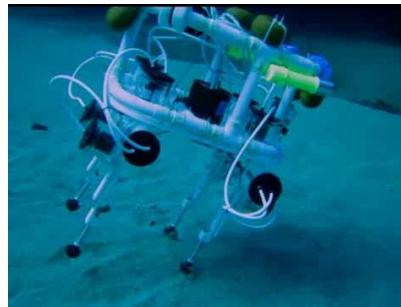
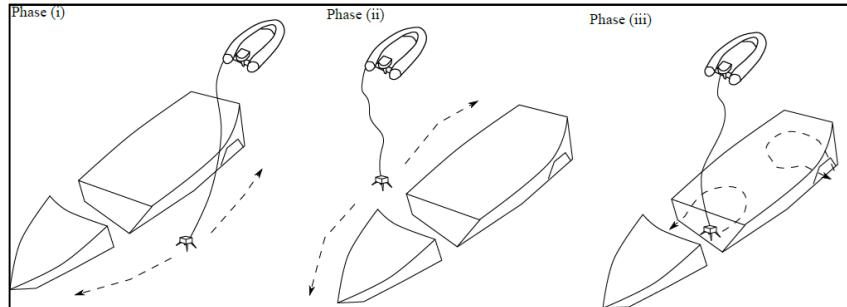
Each leg features a linear spring



1. Design and Development of a remotely operated vehicle on four legs
2. Exploration of the wreck of the Elvискот, Pomonte, Elba Island
3. During the exploration the robot will collect pictures, long-exposure pictures, and videos.



# SILVER: Seabed-interaction legged vehicle for exploration and research



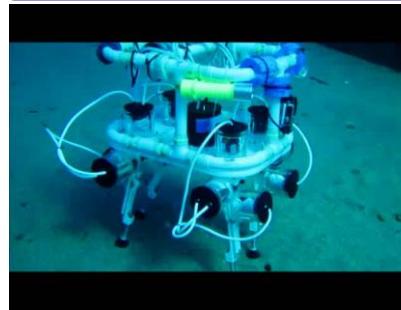
## Static gaits

- Walking
  - Crawling
  - On spot rotation
- Precise foot placement is allowed by the rigid structure of the leg.  
Nothing new, just implemented as in literature.

## Dynamic gaits

- Forward hopping
  - Rotation hopping
- Enabled by compliancy.  
Disturbance rejection (self stabilization).  
Based on reduced order model for underwater dynamic legged locomotion.

## Self-Stabilizing on uneven ground



## No induced disturbances



## Close inspection

## Station keeping (long exposures)

Picardi G., Laschi C., Calisti M. (2018) "Model based Open Loop Controller of a Multigait Legged Underwater Robot", *Journal of Mechatronics* 55:162-170.

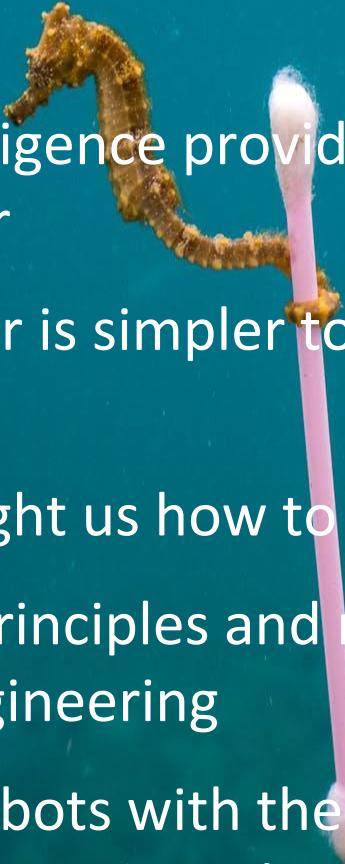
Exploration of the wreck of the Elvscot, Pomonte, Elba Island





# Summary

- Embodied intelligence provides simplifying principles for robot behaviour
- Robot behaviour is simpler to control, but design becomes more complex
- An octopus taught us how to walk underwater
- By identifying principles and modeling them, we can translate biology into engineering
- We can build robots with the ability of walking underwater, to monitor and preserve the oceans



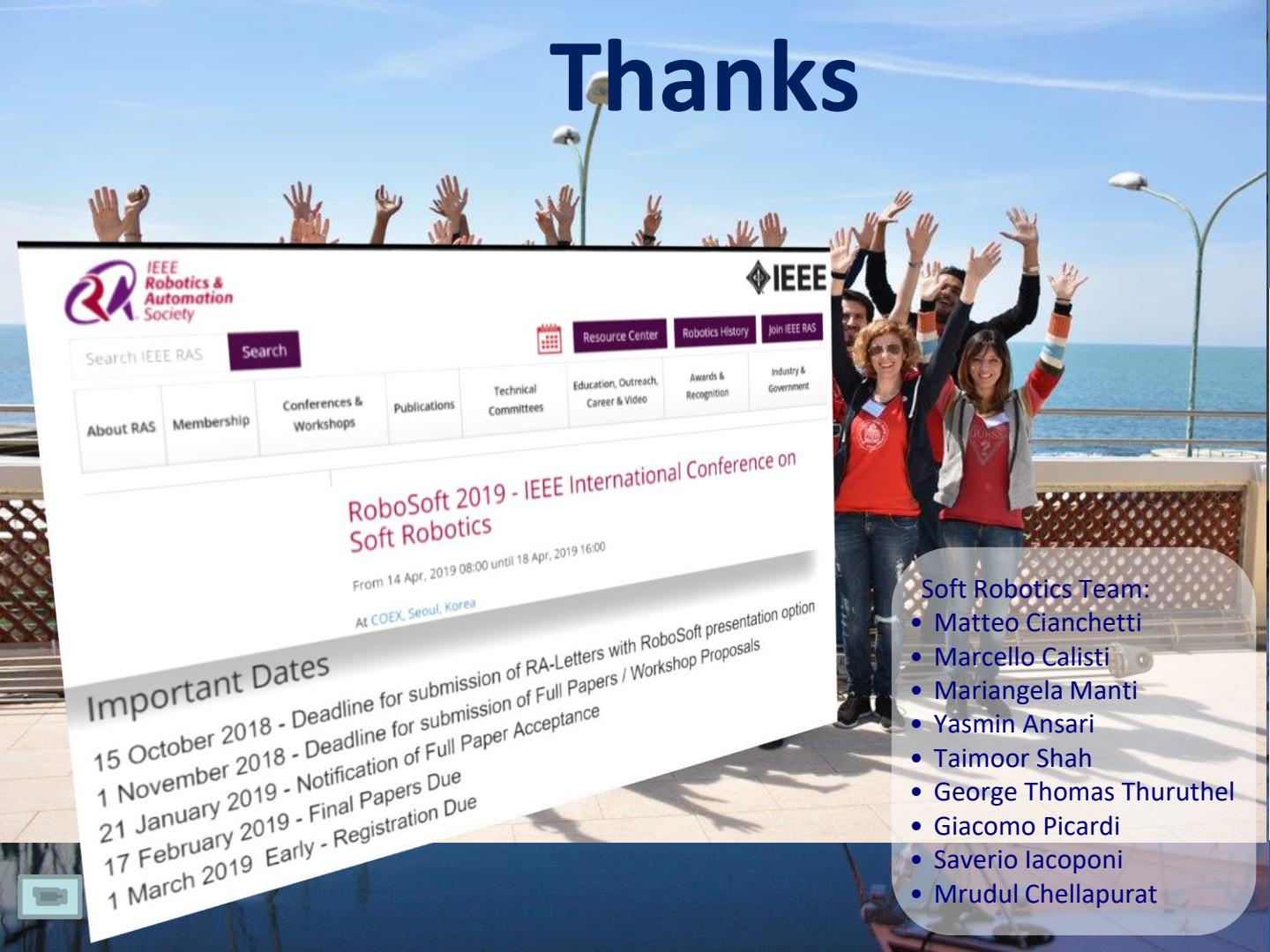
# Blue Resolution

PER UN MARE SEMPRE PIÙ BLU!



A soft benthonic robot  
searching for plastic on the  
seafloor

# Thanks



- Blue Resolution - ARBI
- Silver – National Geographic
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