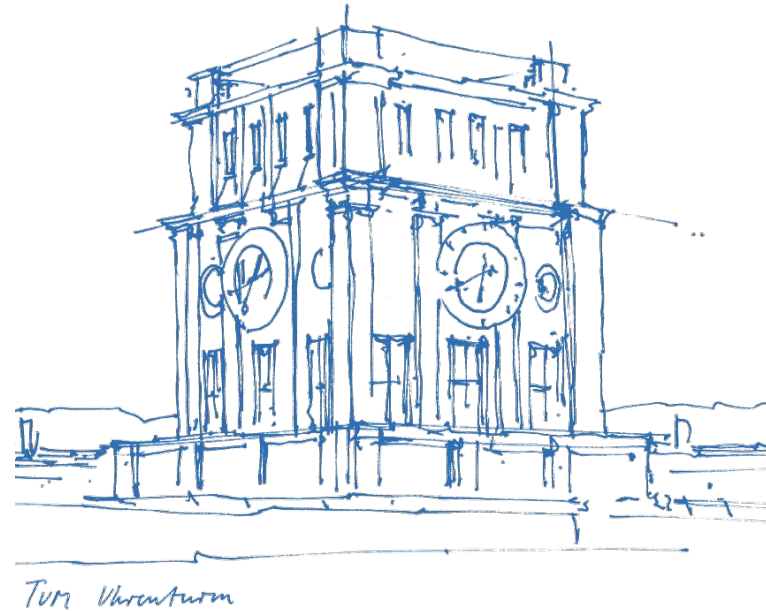


# NISE Snake Robot Challenge





Kunal Aggarwal, Katja Frey, Alexandra Samoylova,  
Oscar Soto Rivera, Maria Zeller

Elite Master Program Neuroengineering  
Technical University of Munich

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# Building the Network and Working Out Coordinated Locomotion:

- **Matsuoka oscillator model:** several parameters influence CPG output  
     robot's control becomes complicated and difficult
- **Phase Oscillator Model** (Nor & Ma, 2013, Nor & Ma, 2014)  
    The paper describes:  turning behavior  
                               change in # of S-shapes (motion pattern change)  
     a promising approach!

# Phase Oscillator Model

*Mathematical model of Phase Oscillator:*

$$\tau \dot{\theta}_i = 2\pi \nu_i + \sum w_{ij} \sin(\theta_j - \theta_i - \phi_{ij})$$

*Output of each oscillator:*

$$x_i = A \cos(\theta_i)$$

$$\text{goal\_position} = x_i + \text{offset}$$

→ solved with Euler Method

Time evolution of the phase  $\theta_i$

Intrinsic frequency

Coupling oscillator  $j$  to oscillator  $i$

Phase of the  $j$ th oscillator

Phase of the  $i$ th oscillator

Phase bias

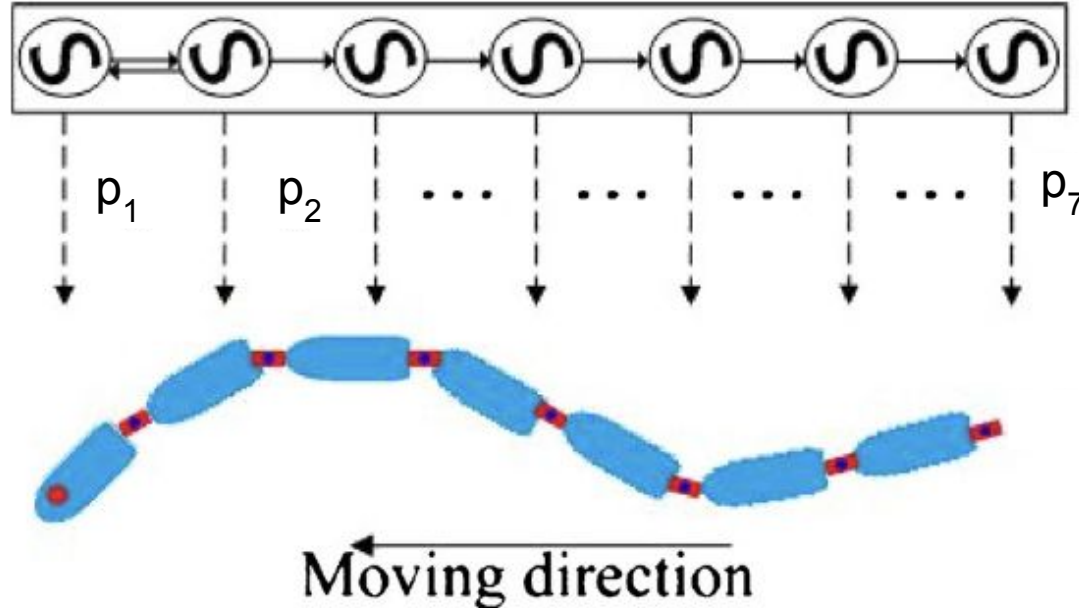
Time constant

Amplitude

Trajectory offset

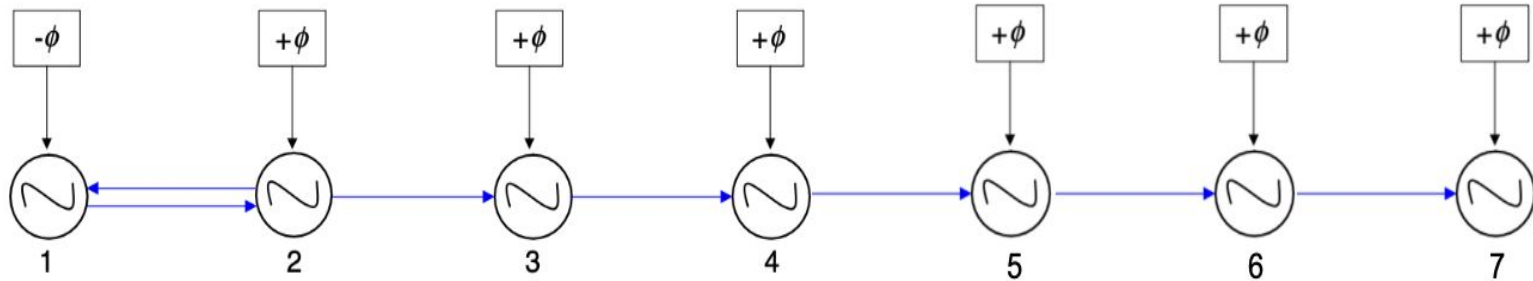
# Phase Oscillator Model

*Unidirectional coupling:*



# Phase Bias Parameter

- $\phi_{ij} = \phi$  for all oscillators
- the sign ( $\pm$ ) for  $\phi$  for oscillator 1  $\rightarrow$  opposite to the other oscillators



# Straight Movement Parameters

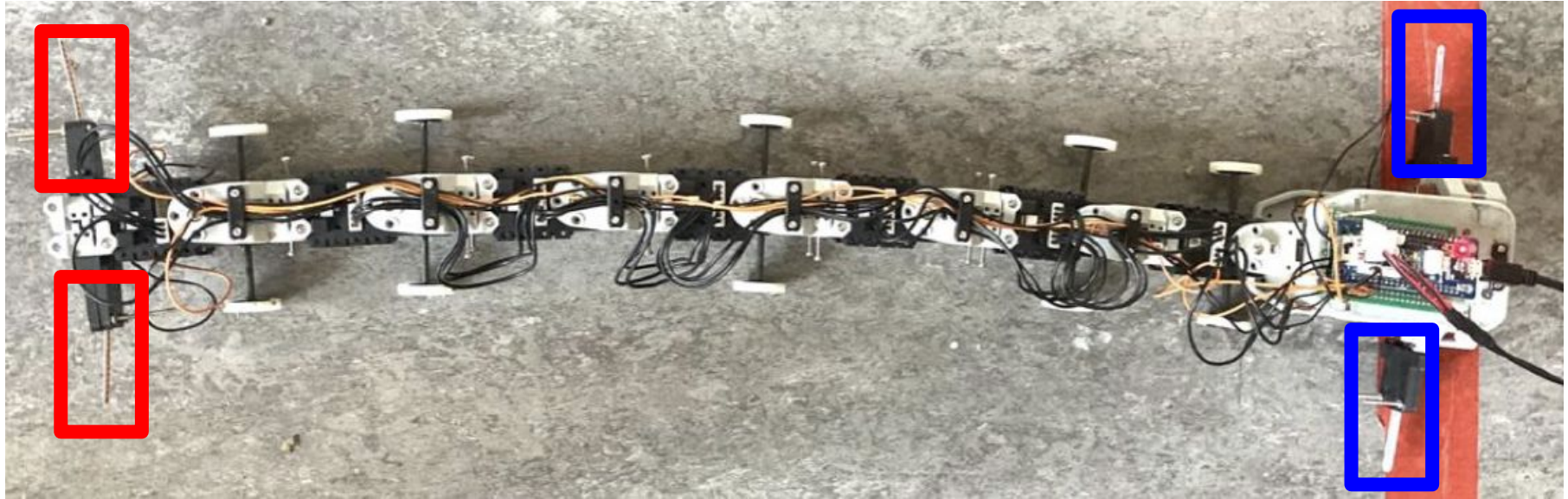
Parameter	$W$	$\phi$	$A$	<i>trajectory offset</i>	$\tau$	$v$
Value	10	$2\pi/7$	120	511	0.2	0.8

→ same for all oscillators

# Changing Behaviour

Back sensors:  
Amplitude adjustment

Front sensors:  
Left & right movement



- Behavioural change achieved with just 4 sensors
- Sensors at the head & at the tail for better internal representation of environment

# Changing Behaviour

***Phase transition-based turning** is not robust in practice (slides 23,24).  
So, we developed our own approach, based on **offset parameter**:*

***Left turn:** decrease trajectory offset*

Parameter	$W$	$\phi$	$A$	<i>trajectory offset</i>	$\tau$	$v$
Value	10	$2\pi/7$	120	max 500 min 451	0.2	0.8

***Right turn:** increase trajectory offset*

Parameter	$W$	$\phi$	$A$	<i>trajectory offset</i>	$\tau$	$v$
Value	10	$2\pi/7$	120	min 522 max 571	0.2	0.8

→ duration: 2 seconds



***Phase transition-based approach is not robust in practice (slides 23,25).***

***So, we used an approach based on **Amplitude and Time-constant parameters**:***

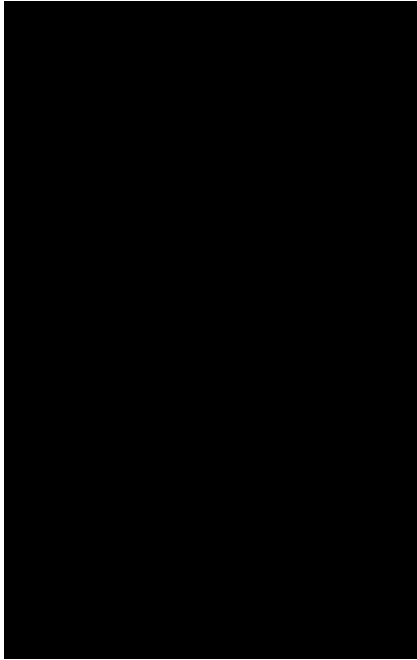
***Amplitude adjustment when entering a narrow section:***

- Decrease parameter  $A \rightarrow$  decreases speed
- Decrease parameter  $\tau \rightarrow$  increases speed

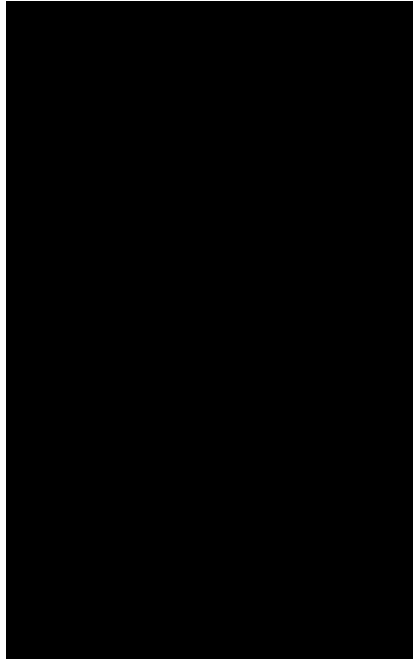
Parameter	$W$	$\phi$	$A$	trajectory offset	$\tau$	$v$
Value	10	$2\pi/7$	60	511	0.08	0.8

$\rightarrow$  duration: 5 seconds

# Changing Behaviour



Right turning



Left turning

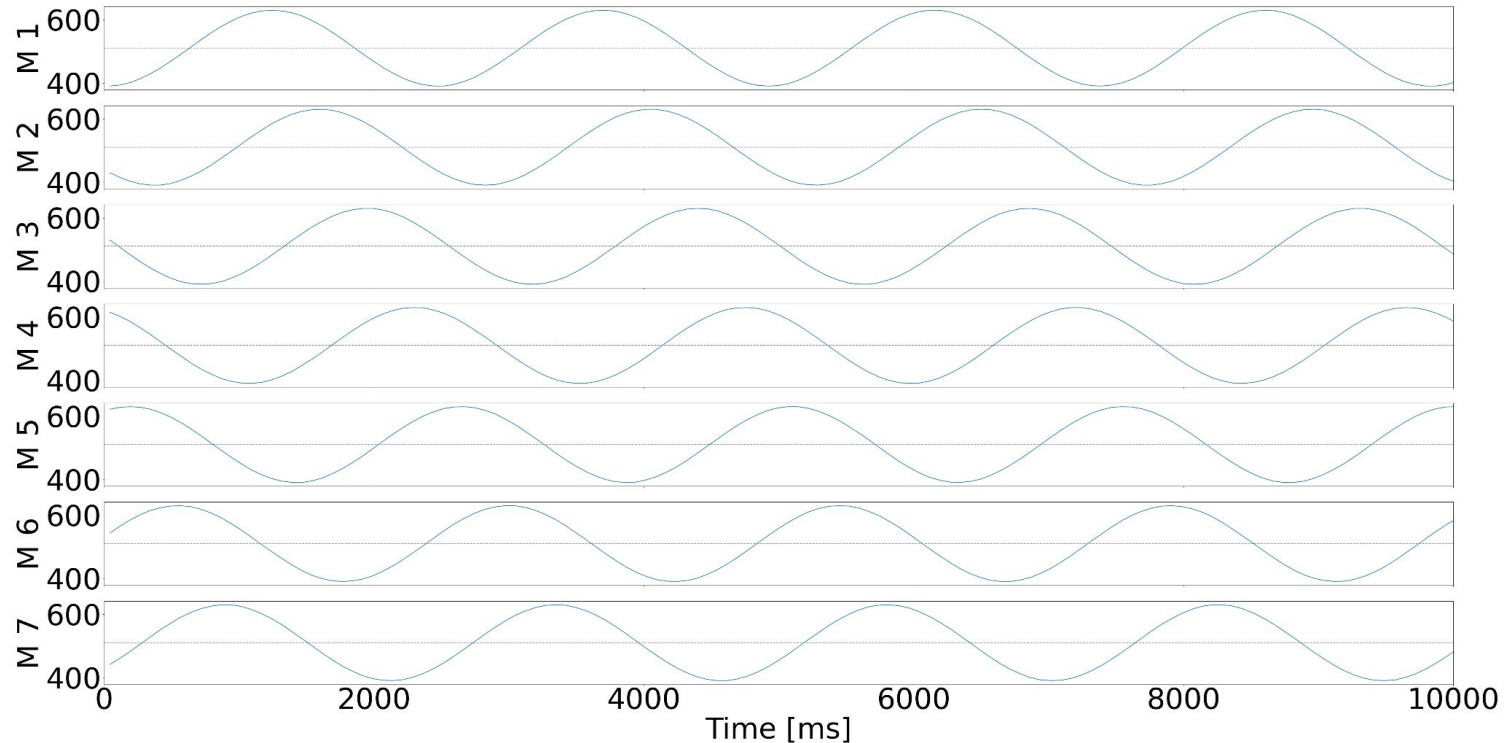


Amplitude change

# Evaluations

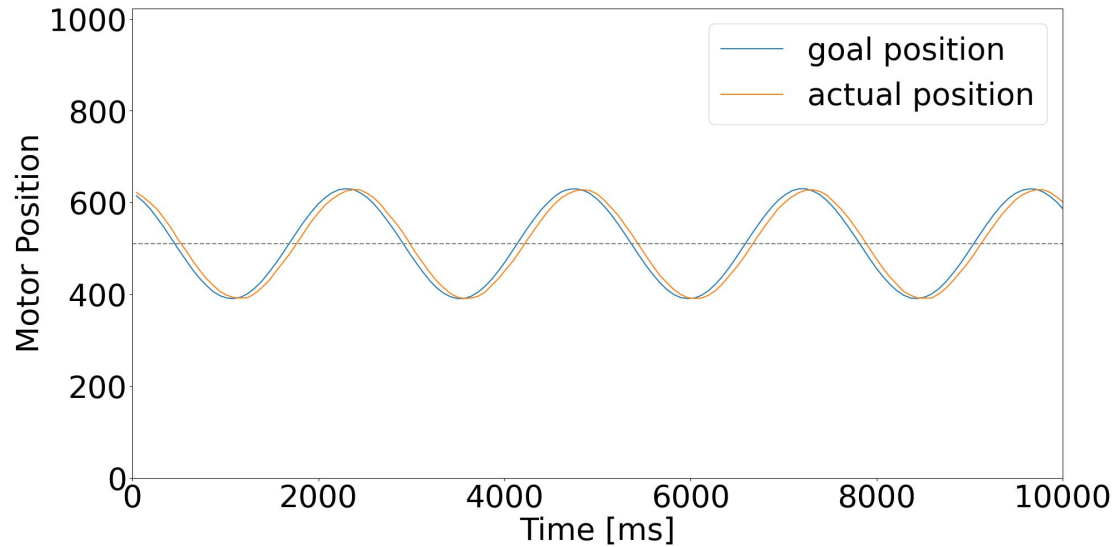
# Phase Shift between CPGs

Param.	$W$	$\phi$	$A$	offset	$\tau$	$\nu$
Value	10	$2\pi/7$	120	511	0.2	0.8



# Default Straight Movement

Param.	$W$	$\phi$	$A$	$offset$	$\tau$	$v$
Value	10	$2\pi/7$	120	511	0.2	0.8

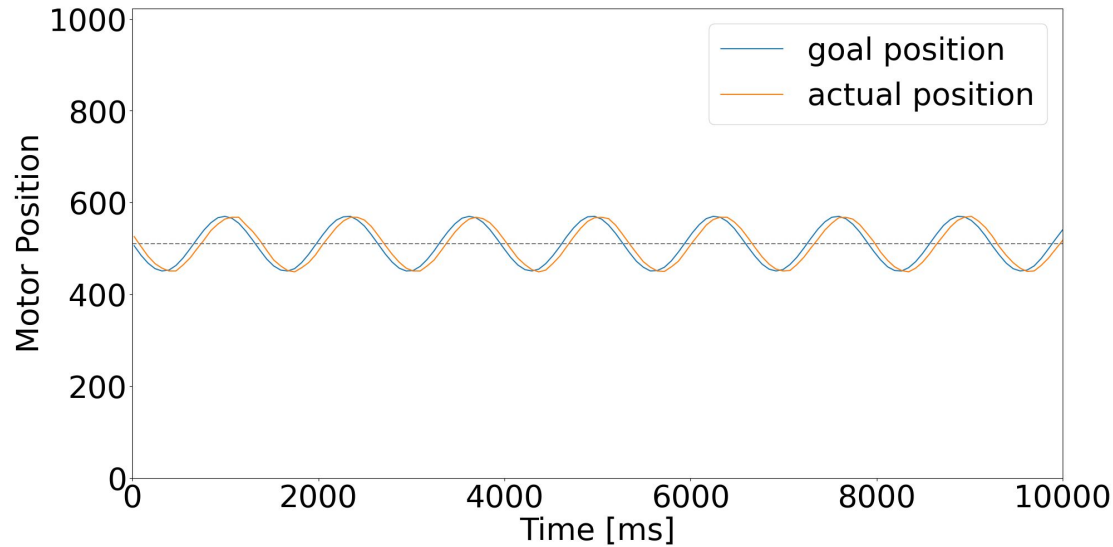


*Speed:*  
0.113 m/s

*Range of Motion:*  
Goal Position: 391 - 630  
Actual Position: 388 - 629

# Narrow Straight Movement

Param.	$W$	$\phi$	$A$	offset	$\tau$	$v$
Value	10	$2\pi/7$	60	511	0.08	0.8



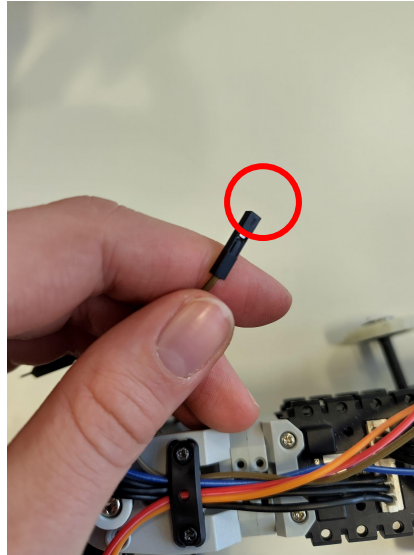
*Speed:*  
0.124 m/s

*Range of Motion:*  
Goal Position: 451 - 570  
Actual Position: 448 - 570

# Hardware Fixing during the Project



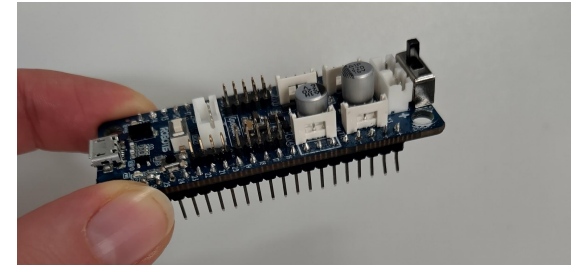
Sensor and sensor holder replacement



Wire replacement



Motor replacement



Sharing a microcontroller

# Limitations of Implemented Changing Behaviour

- **Jerky turning** behaviour & **amplitude** change might damage the hardware  
→ need for **smoother transitions**
- **A larger number of sensors** would make the robot more robust  
→ sooner wide-to-narrow path transition with **sensors in the middle**
- No **parameter tuning** of the phase bias  $\phi$   
→ might impact the **speed**



Thank you!



# References

- Nor, N. M., & Ma, S. (2013). A Simplified CPGs Network with Phase Oscillator Model for Locomotion Control of a Snake-like Robot. *Journal of Intelligent and Robotic Systems*, 75(1), 71–86.  
<https://doi.org/10.1007/s10846-013-9868-9>
- Nor, N. M., & Ma, S. (2014). CPG-based locomotion control of a snake-like robot for obstacle avoidance. *IEEE International Conference on Robotics & Automation (ICRA)*.  
<https://doi.org/10.1109/icra.2014.6906634>

# Backup Slides

# Constraints on Intrinsic Frequency ( $\nu$ ) and Coupling Strength ( $w$ )

Exemplary for one oscillator  $\theta$  :

$$\dot{\theta}_3 = 2\pi\nu + w \sin(\theta_2 - \theta_3 + \phi)$$

Setting the ODE to 0 we obtain:

$$2\pi\nu + w \sin(\theta_2 - \theta_3 + \phi) = 0$$

Solving for  $\theta_3$  we get:

$$\theta_3^\infty = \theta_2 + \phi + \sin^{-1}(2\pi\nu/w)$$

$\theta_3$  will always evolve at constant phase difference of:

$$\theta_2 + \phi + \epsilon, \text{ where } \epsilon = \sin^{-1}(2\pi\nu/w)$$

for the output of oscillator, to converge to oscillations that are phase locked with a phase difference of  $\phi$ , we need:

$$\nu \ll w$$

for  $\epsilon$  to become so small that it can be neglected

→ introduction of parameter  $\tau$  to control both  $\nu$  and  $w$  while keeping the system dynamics

# Phase Bias Parameter

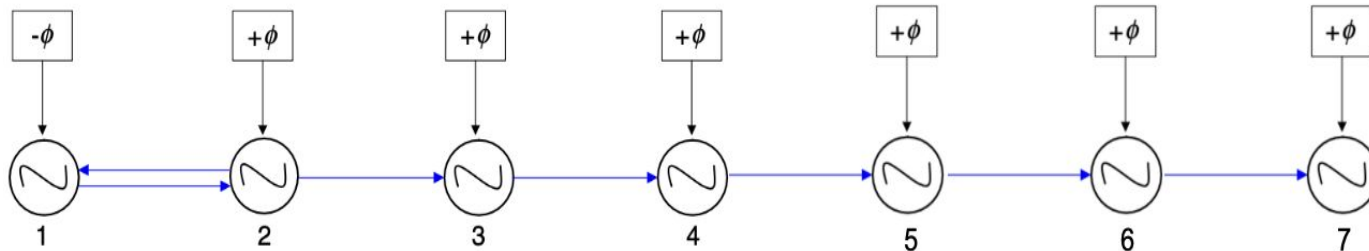
- $\phi_{ij} = \phi$  for all oscillators with:

$$\phi = 2\pi N/n$$

$N = \#$  of S-shapes ,

$n = \#$  of actuated joints from head to tail

- The sign ( $\pm$ ) for  $\phi$  for oscillator 1  $\rightarrow$  opposite to the other oscillators



# Modification of Number of S-Shapes (N) via Phase Transition

In order to change number of S-shapes  $N$  in robot's locomotion from  $N1$  to  $N2$ , phase bias should be changed from  $\phi1$  to  $\phi2$ . This happens during phase transition time ( $t2-t1$ ), by continuously adjusting bias term as follows :

$$\phi = \phi_1 - \alpha(t_1 - t)$$

$$\alpha = \phi_1(N_2/N_1)(1 - (N_1/N_2))/(t_2 - t_1)$$

Where:

$\phi1$  - old phase bias term

$t1$  - phase transition start time

$\phi2$  - new phase bias term

$t2$  - phase transition end time

$N1$  - old # of S-shapes

$t$  - current time

$N2$  - new # of S-shapes

# Attempted Implementation of Behaviour Change via Modification of Number of S-Shapes (N) via Phase Transition

We implemented **phase transition via modification of phase bias parameter** as described in *Nor & Ma, 2013*. We applied phase transition strategy to implement:

1. **Turning behavior** by transitioning from  $N1 \rightarrow N2$ , where  $N1 > N2$
2. **Oscillation amplitude/frequency change in narrow/wide path behavior**, with  $N1 \rightarrow N2$   
where  $N1 > N2$  for wide- $\rightarrow$ narrow change  
where  $N1 < N2$  for narrow- $\rightarrow$ wide change

For both behaviors, we observed the expected result: change in number of S shapes  
However, these **changes were not robust enough** for real-world use (*see next slides*).

# Attempted Implementation of Behaviour Change via Modification of Number of S-Shapes (N) via Phase Transition

## Turning behavior:

For turning behavior,  $N_2$  must be smaller than  $N_1$ .

We observed desired pattern change for  $N_2=2$  and  $N_1=1$  as well as  $N_2=1.5$  and  $N_1=1$ .

Next we needed to find a  $(t_2-t_1)$  parameter which would guarantee that snake makes **less than 0.5 of motion cycle** (otherwise it continues straight motion, with the new number of S-shapes  $N_2$ ).

We used  $(t_2-t_1)$  parameters ranging from 0.1 to 10 seconds:

- For  $(t_2-t_1) < 2\text{sec}$ , we observed no pattern change
- For  $(t_2-t_1) \geq 2\text{sec}$ , snake makes one movement cycle or more, moving straight (not turning).

**One possible reason:** the method is not robust enough.

In *Nor & Ma, 2013*, turning behavior via phase transition was simulated,  
but no exhaustive experimental results proving robustness of the method were provided.



# Attempted Implementation of Behaviour Change via Modification of Number of S-Shapes (N) via Phase Transition

## Oscillation amplitude/frequency change in narrow/wide path behavior:

For the above mentioned behavior, depending on environment change, the number of S-shapes should either increase (wide->narrow path) or decrease (narrow->wide path). After this change, straight movement should proceed.

**We observed expected pattern changes** for  $N_1=1$  and  $N_2=2$ ,  $N_1=1$  and  $N_2=3$ ,  $N_1=1$  and  $N_2=1.5$ ,  $N_1=2$  and  $N_2=1$ ,  $N_2=1$  and  $N_2=1$ ,  $N_1=1.5$  and  $N_2=1$ .

However, we observed, that during transitions  $N_1 \rightarrow N_2$  **where  $N_2 > N_1$** , the snake develops  $N_2 > 4$  some time after phase transition. The number of S-shapes is too large for effective straight movement, so the **snake does not move effectively** (even though motors are turning).

**One possible reason:** flaws in our implementation.

Even though the approach worked well for  $N_1 > N_2$ , it failed for  $N_1 < N_2$ , so we could not use it.

# Parameter Tuning

Parameter	$W$	$\phi$	$A$	<i>offset</i>	$\tau$	$v$	<i>speed</i>
Nor & Ma, 2013	10	$2\pi/7$	1	511*	0.2*	0.1	0 m/s
Measurement 2	10	$2\pi/7$	120	511	0.2	0.1	0.013 m/s
Measurement 3	10	$2\pi/7$	120	511	0.08	0.1	0.026 m/s
Measurement 4	10	$2\pi/7$	120	511	0.08	0.8	0.232 m/s
<b>Chosen Default</b>	10	$2\pi/7$	120	511	0.2	0.8	0.113 m/s
Measurement 6	10	$2\pi/7$	60	511	0.2	0.8	0.054 m/s
<b>Chosen Narrow</b>	10	$2\pi/7$	60	511	0.08	0.8	0.124 m/s

no movement  
→ increase  $A$

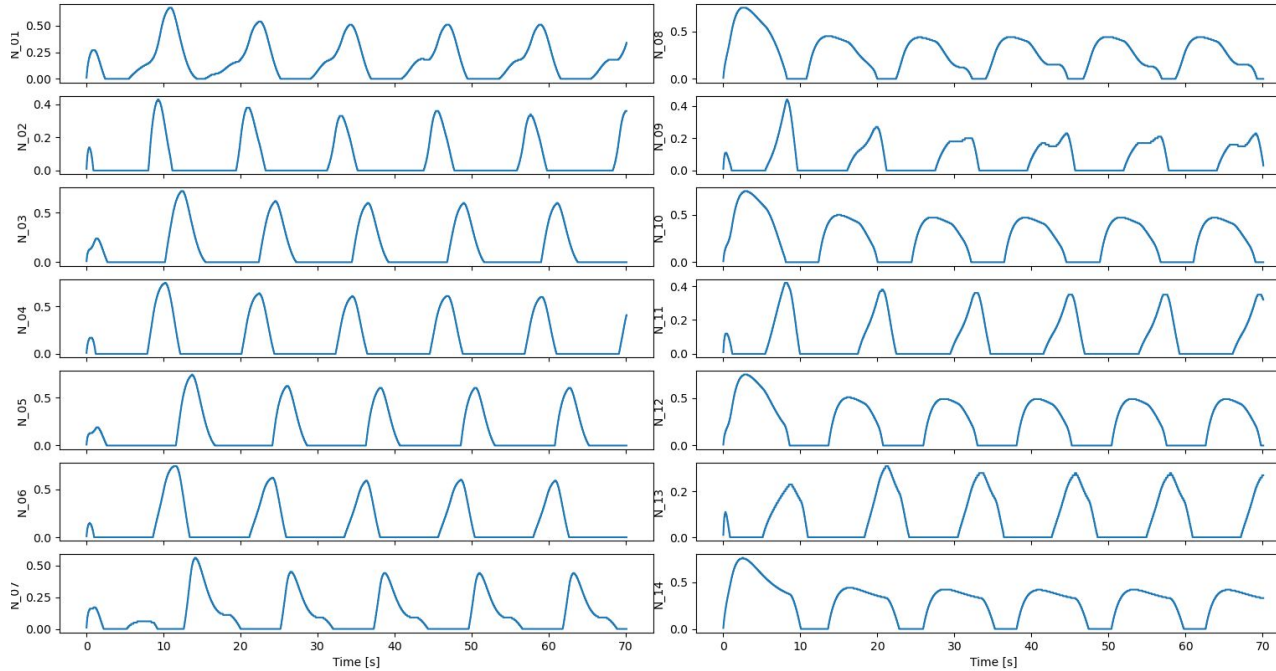
very slow  
→ decrease  $\tau$  \*\*

still slow  
→ increase  $v$   
violent speeding  
→ decrease  $\tau$

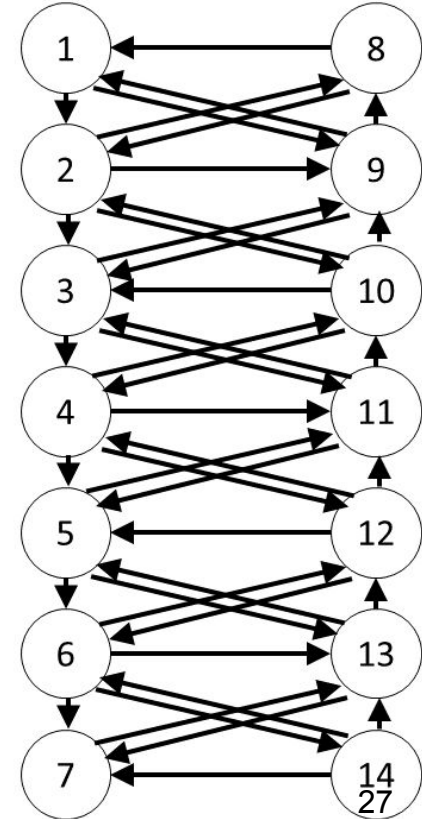
explore narrow movement  
→ decrease  $A$   
too slow  
→ decrease  $\tau$

\* not specified in paper,  $1/20 \geq \tau \leq 1$ , \*\* for relationship  $v$ ,  $w$ ,  $\tau$  see slide 20

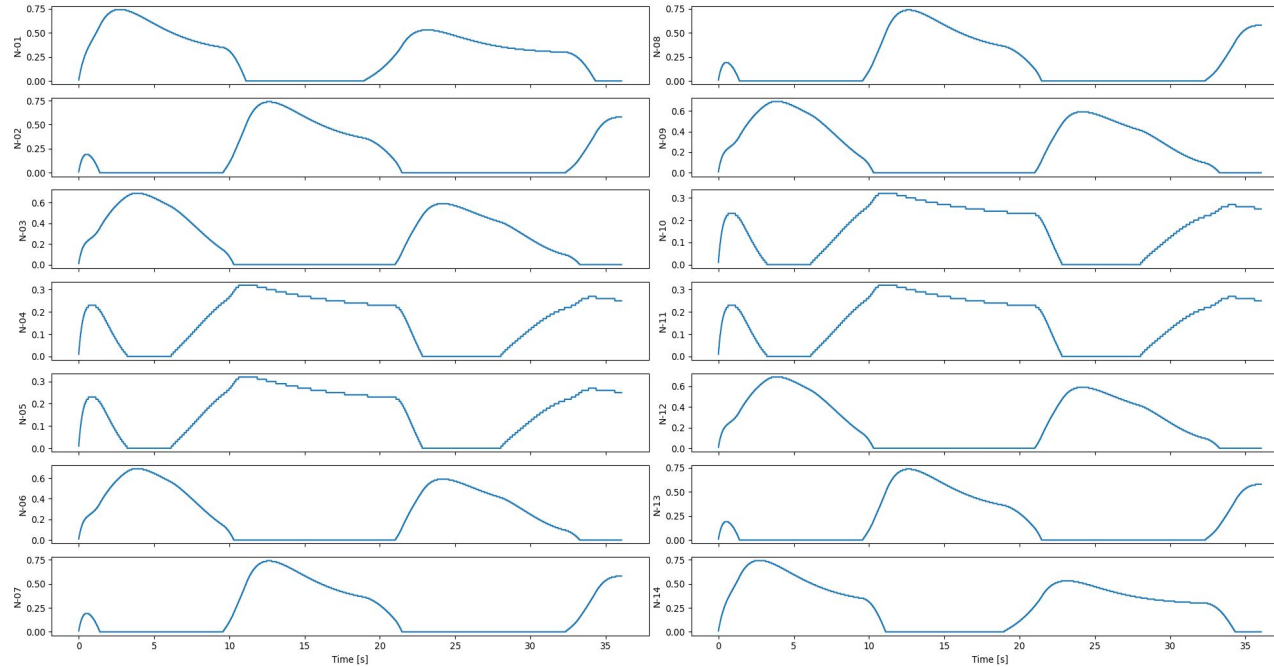
# Matsuoka Model Configurations Testing



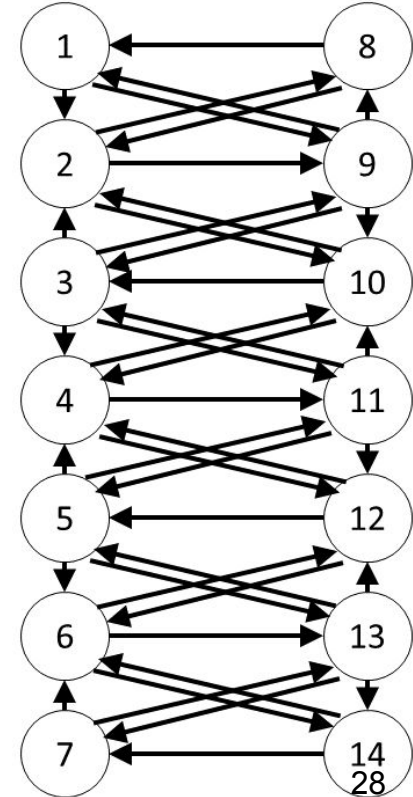
→ no horizontal mutual inhibition, phase difference too large, varying shapes



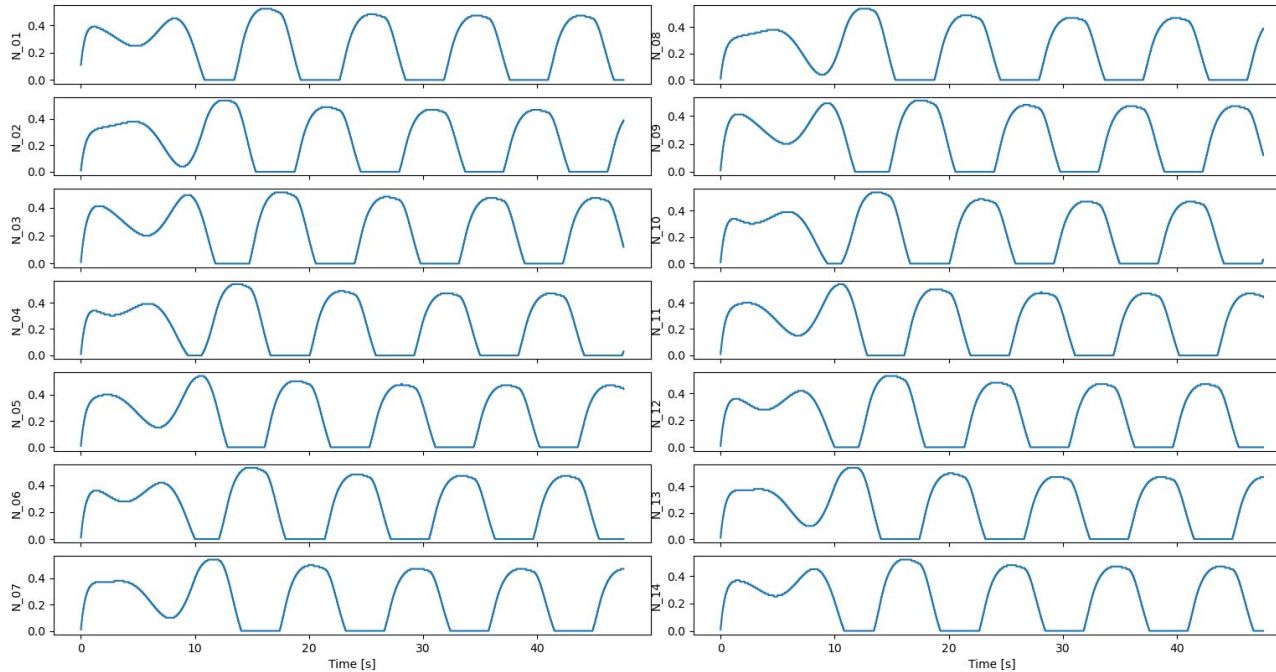
# Matsuoka Model Configurations Testing



→ period and phase difference too large, varying shapes



# Matsuoka Model Configurations Testing



→ phase difference too large

