

# Visualization of Stable Heteroclinic Channel-based Movement Primitives

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## Key Challenges

- Employing neural dynamics for robotic control
  - Producing a functional, biologically-relevant control framework

- Introducing an adjusted movement primitive framework
  - Replacing the underlying stable equilibria of dynamic movement primitives (DMPs) with stable heteroclinic channels (SHCs)
  - Proving that this new framework is comparable to DMPs

## Control Frameworks

Governing equation:

$$\tau \dot{y} = \alpha_y (\beta_y (g - y) - \dot{y}) + f$$

### DMP formulation

$$f(x) = \frac{\sum_{i=1}^K \psi_i w_i x}{\sum_{i=1}^K \psi_i}$$

$$\tau \dot{x} = \alpha_x x$$

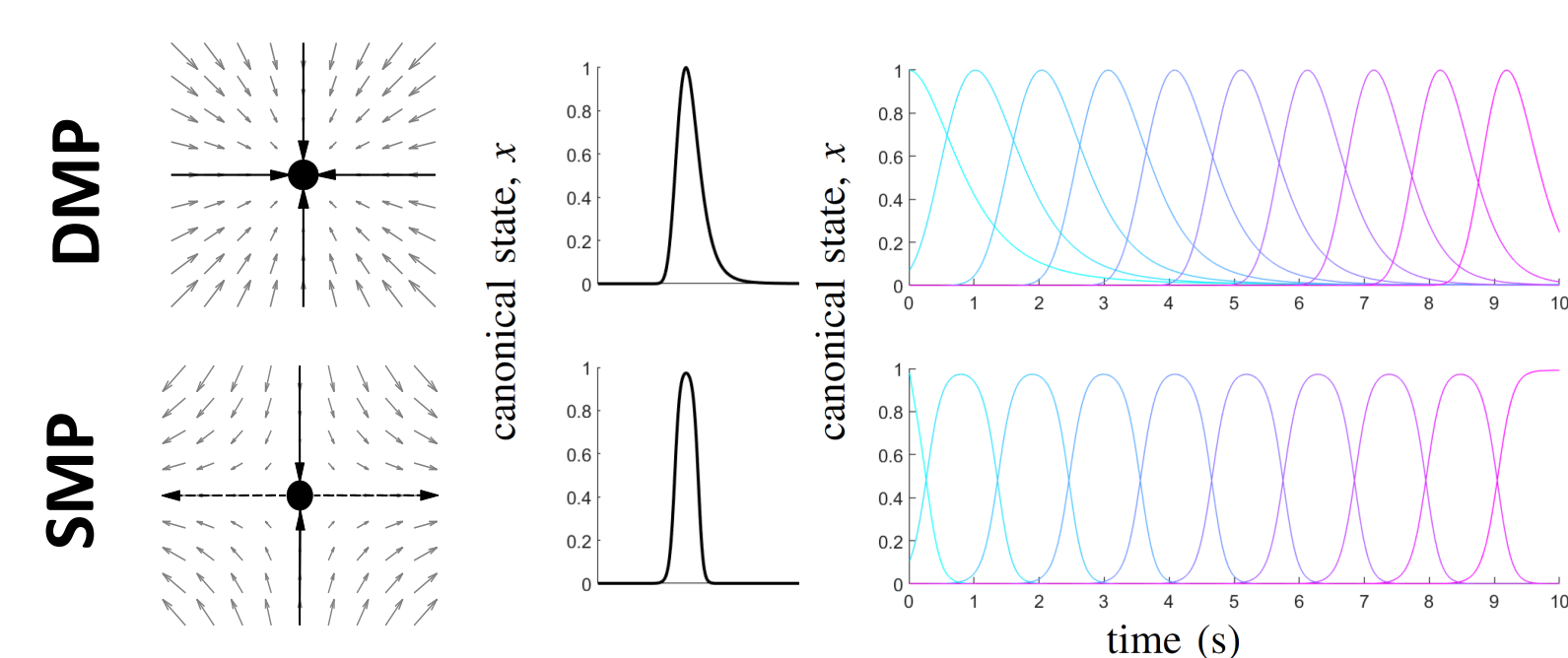
$$\psi_i = \exp\left(\frac{-1}{2\sigma_i^2} (x - c_i)^2\right)$$

### SMP formulation

$$f(x_i) = \sum_{i=1}^K x_i w_i$$

$$\tau dx_i = x_i \left( \alpha_i - \sum_{j=1}^K \rho_{ij} x_j \right) dt + \sum_{j=1}^N C_{ij} z_j$$

## Graphical representations

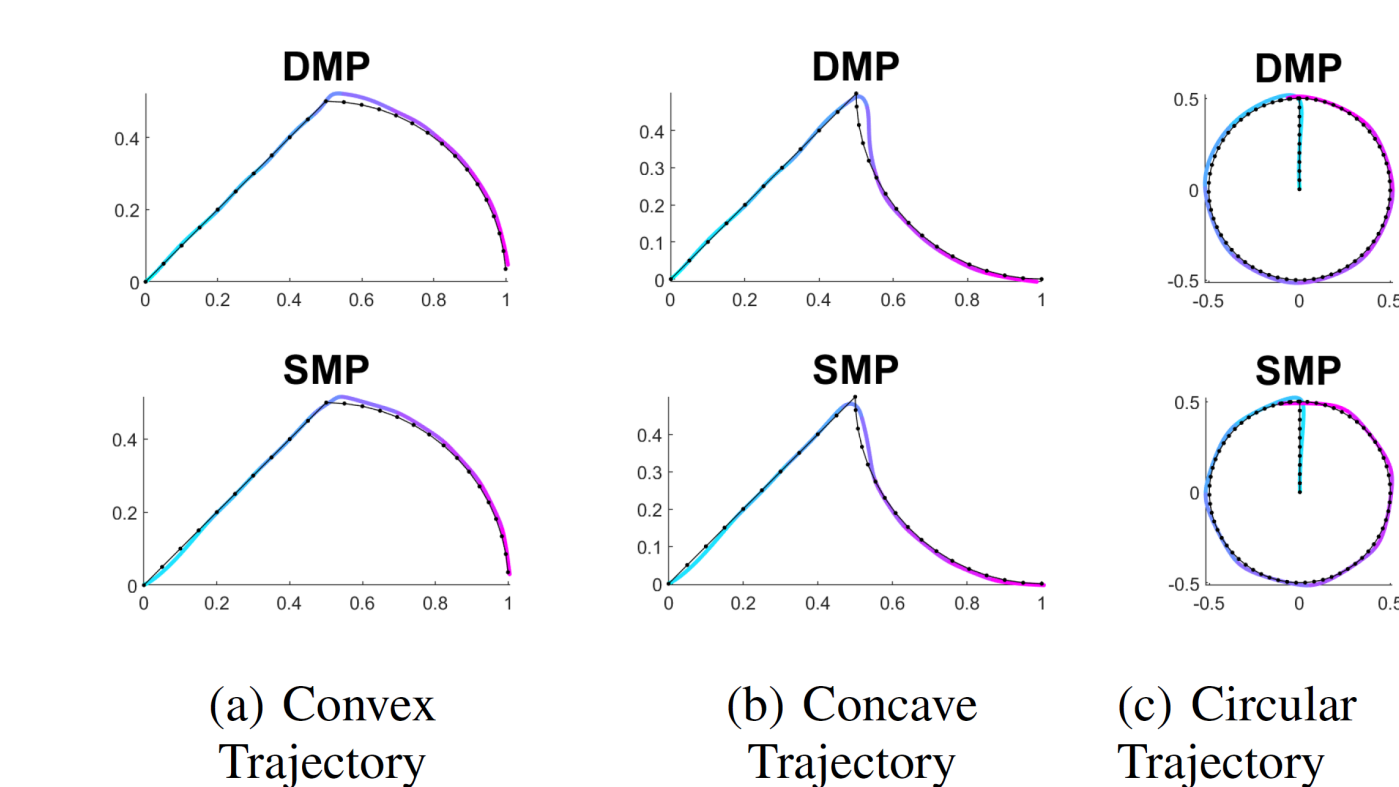


## Reference

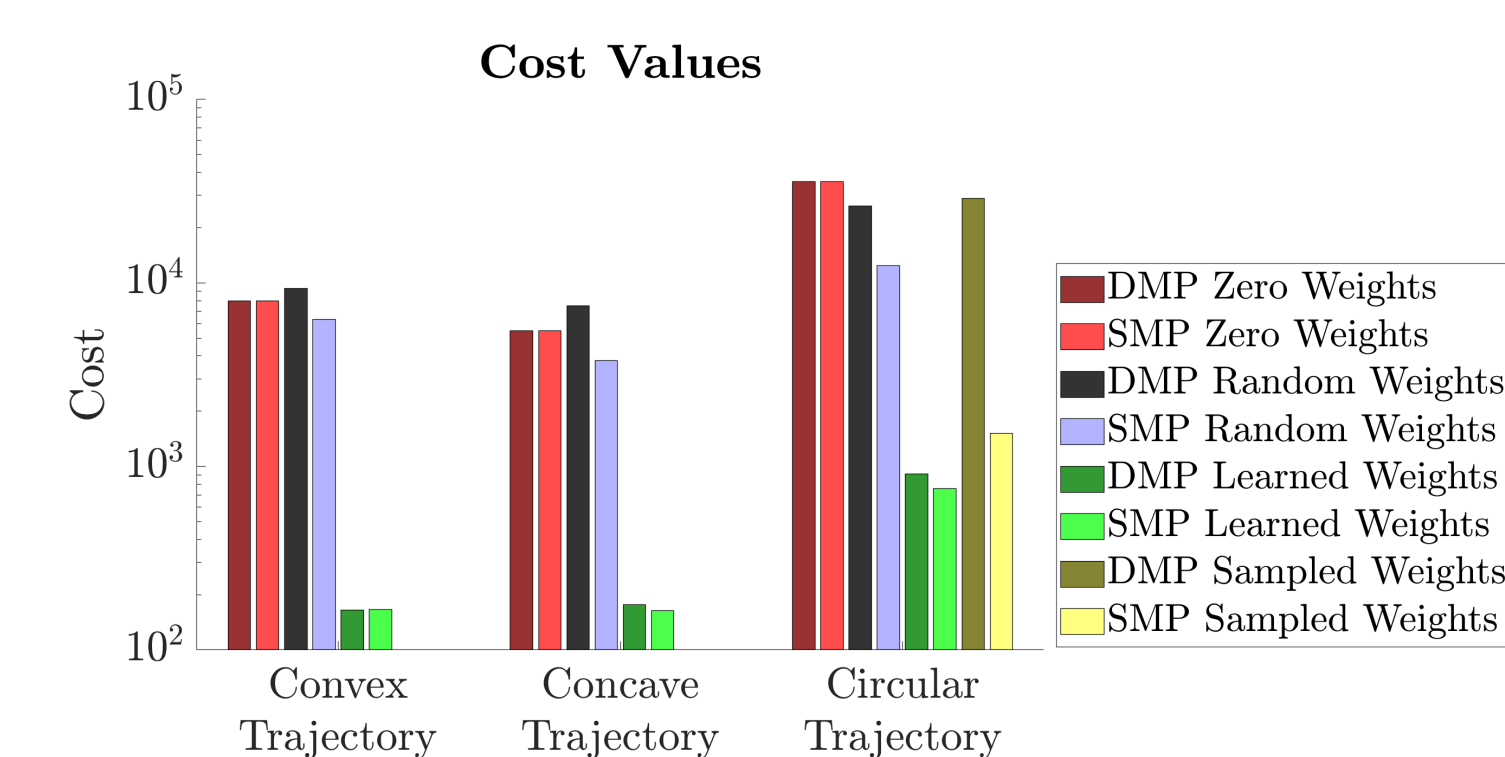
N. A. Rouse and K. A. Daltorio, "Visualization of Stable Heteroclinic Channel-based Movement Primitives," in *IEEE Robotics and Automation Letters*, doi: 10.1109/LRA.2021.3061382.

## Evaluation

Trajectory-following tasks:

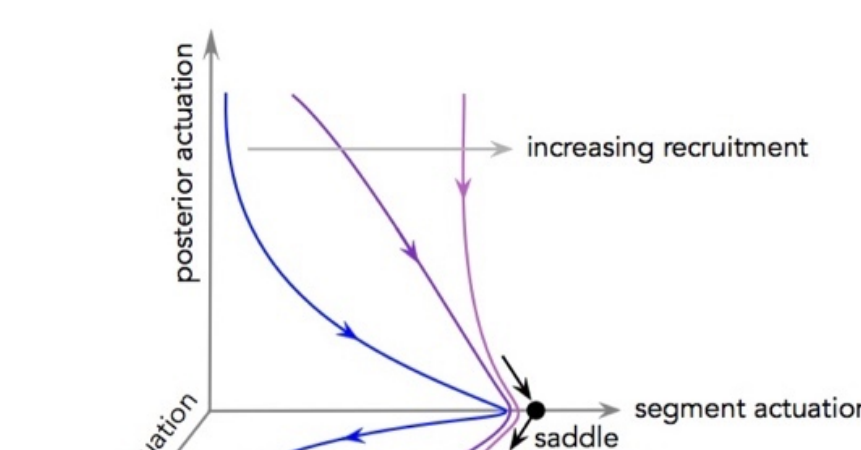
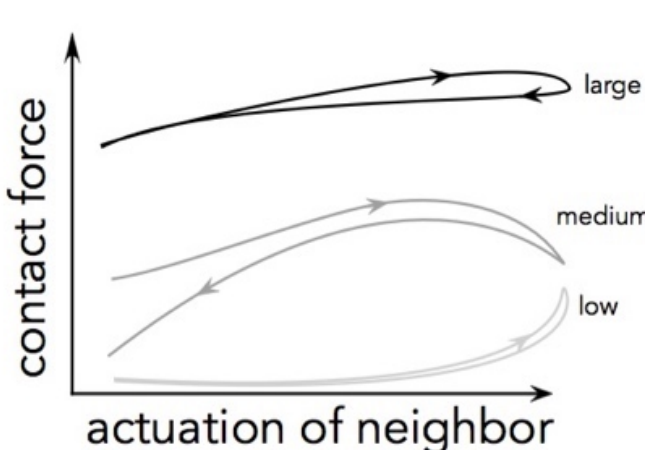
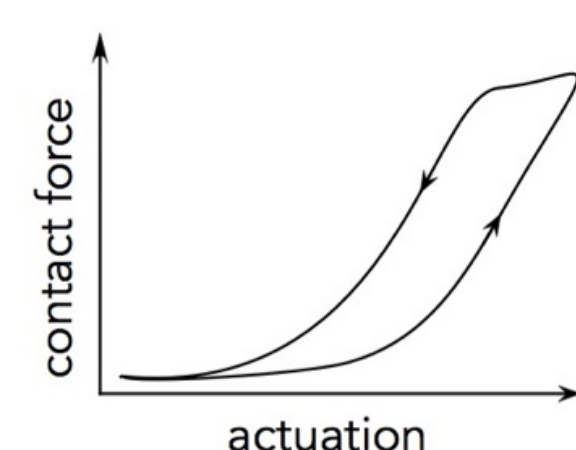


Comparison via kinematic cost function:



## Impact

Movement strategies for worm-like robots:



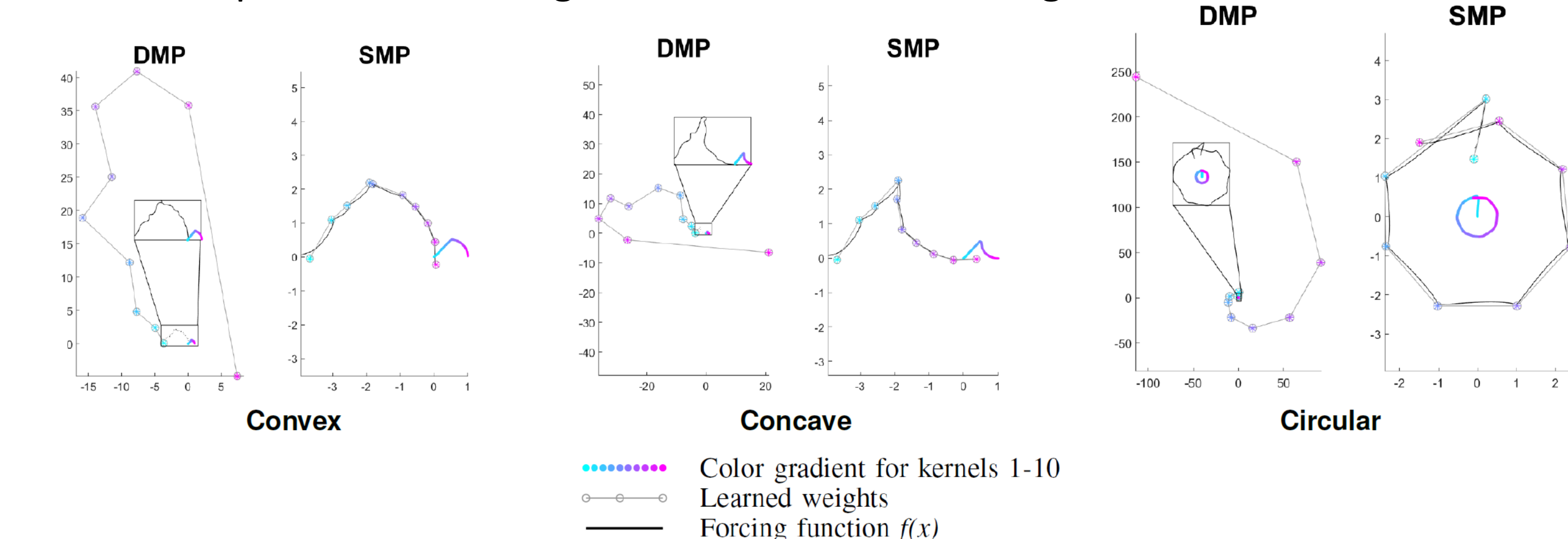
(a) There is a nonlinear, hysteretic relationship between input (actuation force) and output (sensed contact).

(b) We expect actuation of neighboring segments to also affect sensed contact forces.

(c) Recruitment strategy

## Results

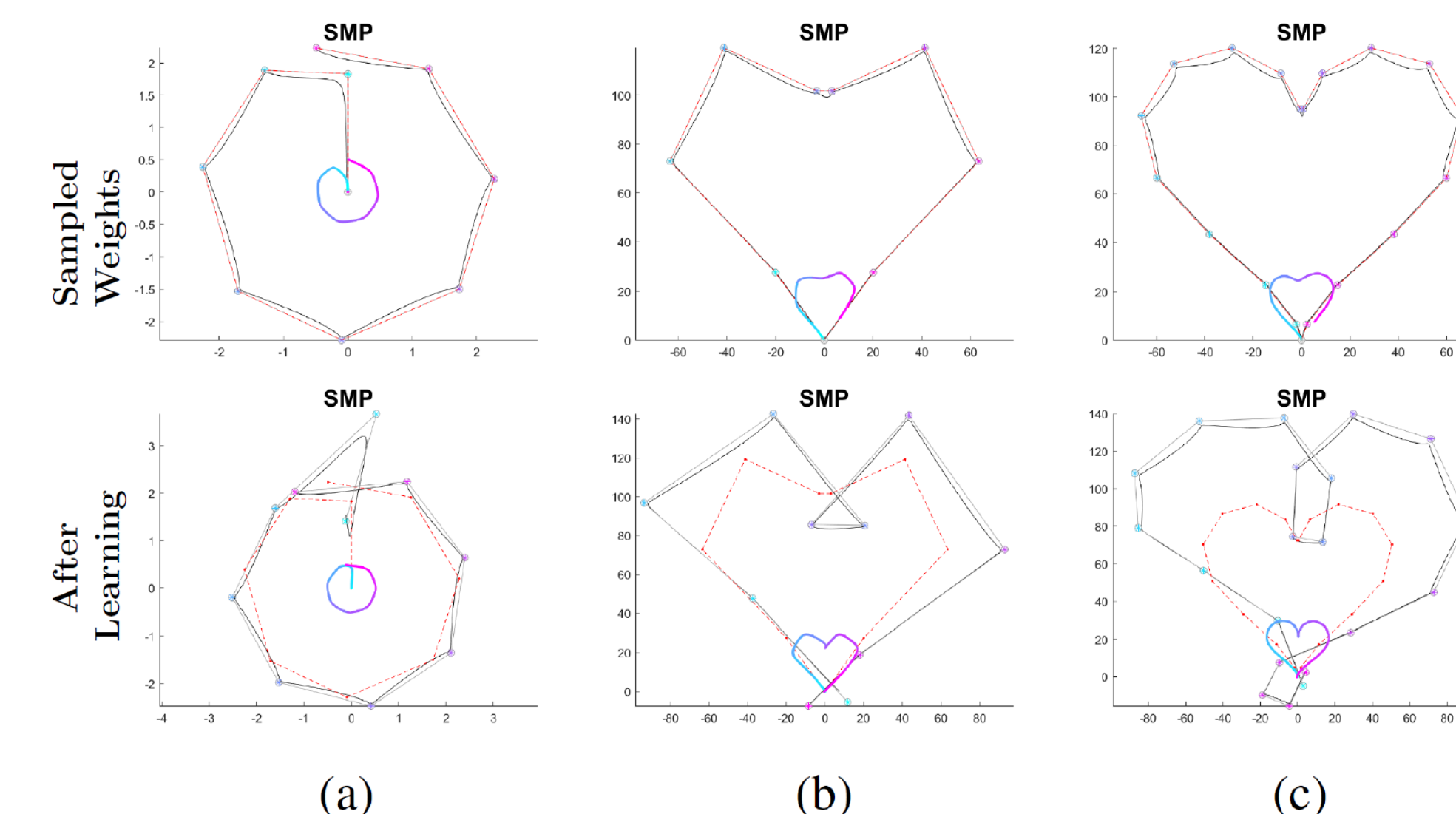
- In phase space, SMP forcing function follows the weighted kernel peaks
- In task space, SMP forcing function follows the weighted kernel locations



Weight sampling:

- Kernel weights for circular trajectory match the trajectory
- Sampling method to initialize weights

$$w = \left( \frac{(\alpha_y v)^2 + \left( \frac{\alpha_y \beta_y}{2} - \tau \left( \frac{v^2}{r} \right) \right)^2}{r} \right) * y_{desired}$$



Legend for After Learning plots:  
 - Learned weights (open circles)  
 - Forcing function (black line)  
 - Weights sampled from forcing function (red line)