



# Bipedal Walkers: From Three to Two Dimensions via Lagrangian Reduction



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# Problem of 3D Walkers



## **1.0 Background: Problem of 3D Bipedal Walkers**

### **1.1 Analysis of 2D Walkers**

### **1.2 Application: Simple Compass-Gait Biped**

### **1.3 Scaling Complexity from 2D to 3D**

## 2.0 Hybrid Reduction from 3D to 2D

### 2.1 Hybridization of Robot Motion

### 2.2 Discrete Foot Impact

### 2.3 Lagrangian Continuous Dynamics

### 2.4 Dependency Simplification of Lagrangian

### 2.5 Routhian Reduction

## 3.0 Results

### 3.1 Reduced Model

### 3.2 Equations of Motion (2D)

### 3.3 Hypothesis of 3D Motion

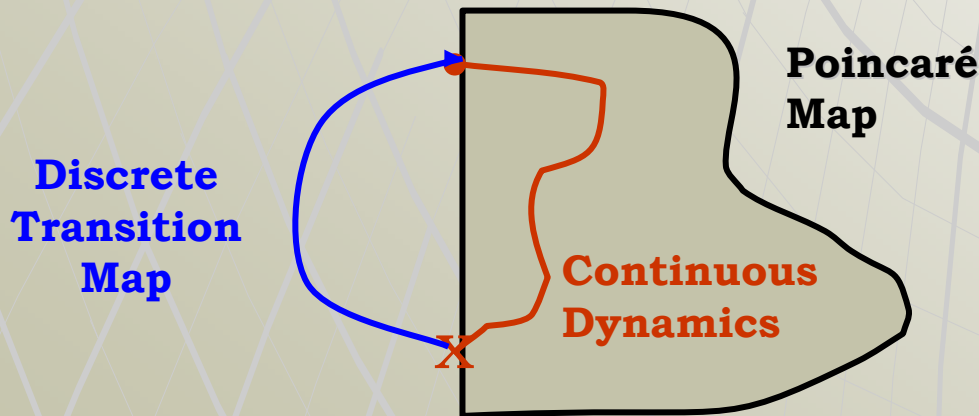
## 4.0 Final Thoughts



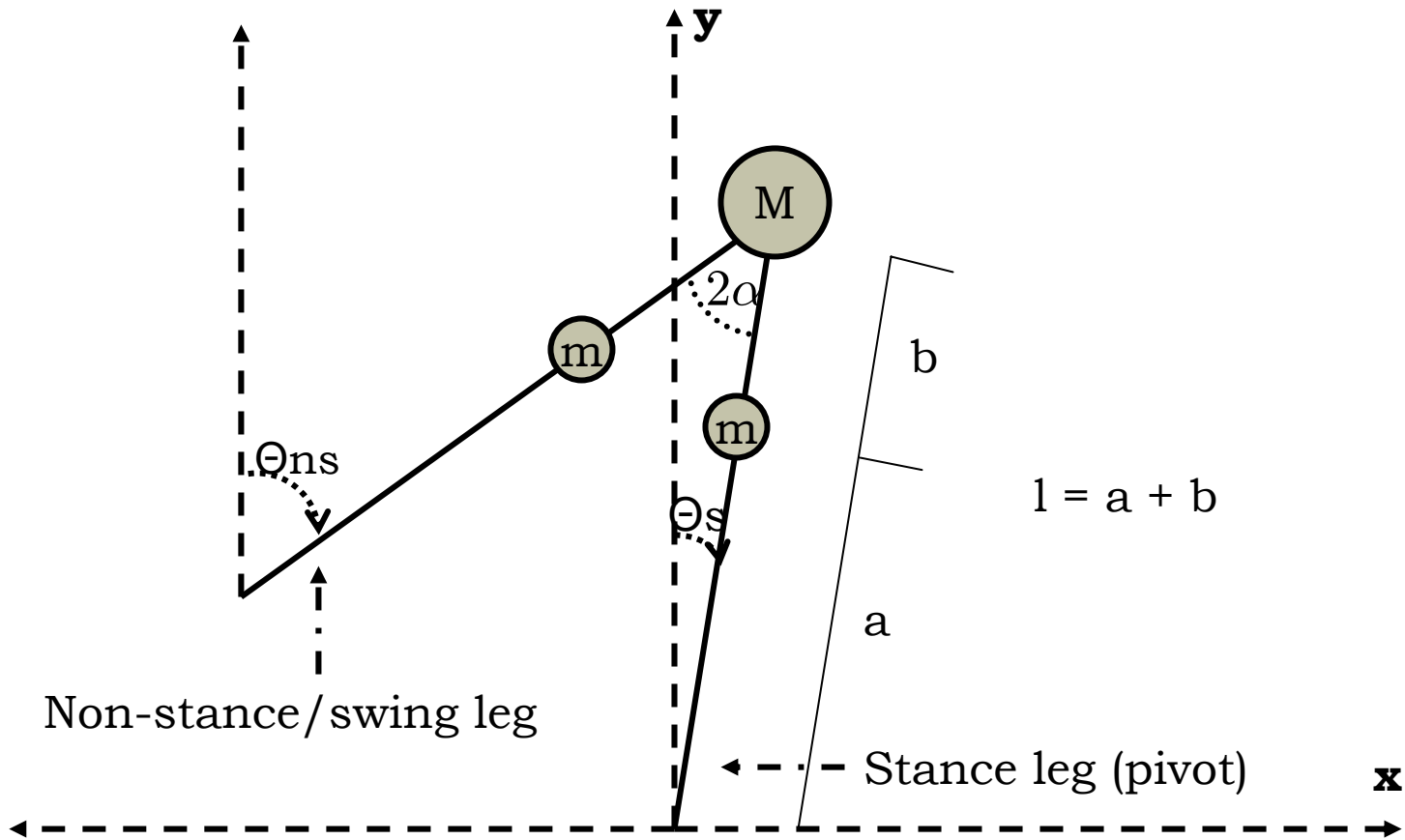
# Analysis of 2D Walkers



- ❖ Many techniques have already been established for analyzing two dimensional bipedal walkers
- ❖ Finding stable walking cycles
  - o Dynamics described by non-linear ODEs
  - o No straightforward backsolving method to find initial states
  - o Solution: Numerical analysis using methods of Poincaré
    - Search feasible phase space for initial states that result in asymptotically stable cycles

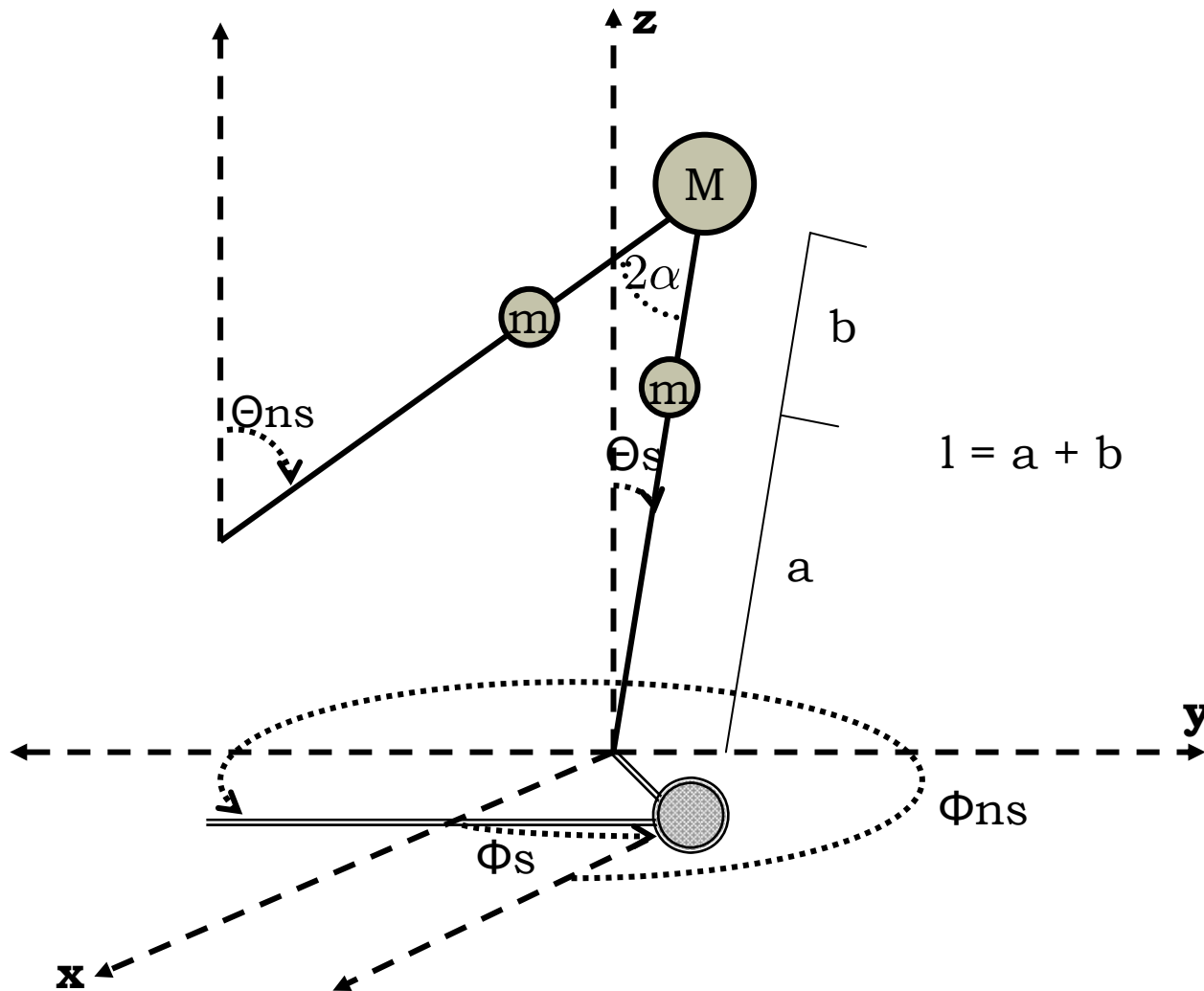


# Compass-Gait Bipedal Walker (2D)



❖ Four state dependencies:  $\Theta_{\text{non-stance}}$ ,  $\Theta_{\text{stance}}$ , and time-derivatives

# Compass-Gait Bipedal Walker (3D)



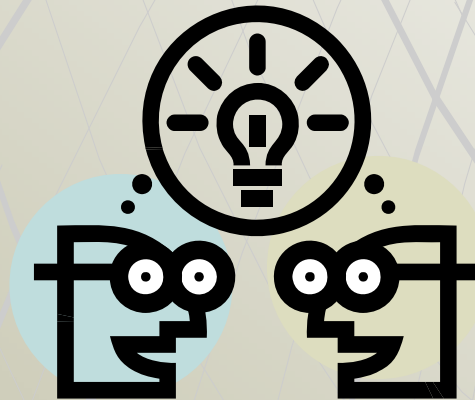
- ❖ Eight state dependencies:  $\Theta_{\text{non-stance}}$ ,  $\Theta_{\text{stance}}$ ,  $\Phi_{\text{non-stance}}$ ,  $\Phi_{\text{stance}}$ , and time-derivatives



# Scaling Complexity



- ❖ Increasing the model's dimensions from two to three results in a two-fold increase of state dependency
- ❖ Thus, in three dimensions, numerical analysis requires a phase space search of *eight* dimensions
- ❖ Analysis is computably impractical!



❖ **Solution:** Hybrid Reduction on the 3D Model



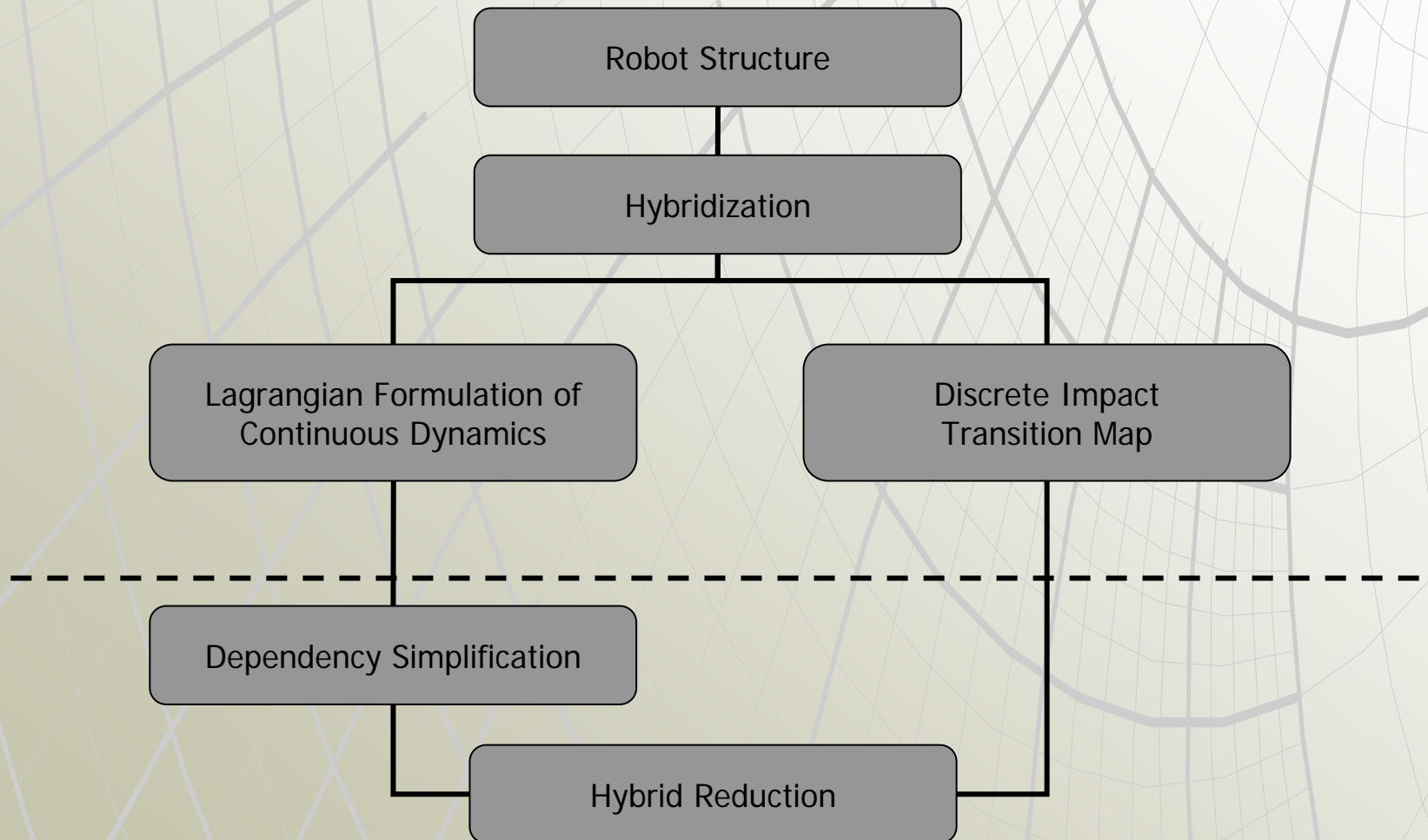
# Hybrid Reduction from 3D to 2D



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  - 2.4 Dependency Simplification of Lagrangian**
    - 2.4.1 Fixing inner angle  $2\gamma$**
    - 2.4.2 Limit as  $M/m$  approaches infinity**
    - 2.4.3 Fixing  $\Phi_s = \Phi_n$  (x-y plane)**
  - 2.5 Routhian Reduction**
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# Process of Reduction (General)



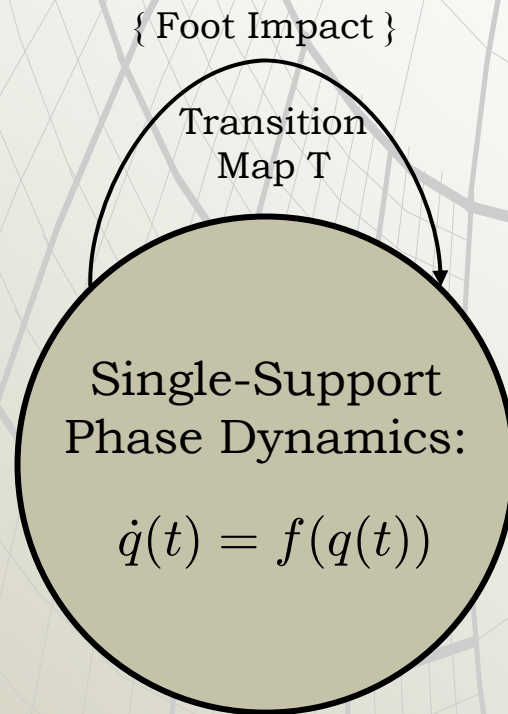




# Hybridization



- System's single-support phase guided by differential equations (continuous dynamics)
- Swing leg's impact with ground considered a reset transition for hybrid system (discrete event)



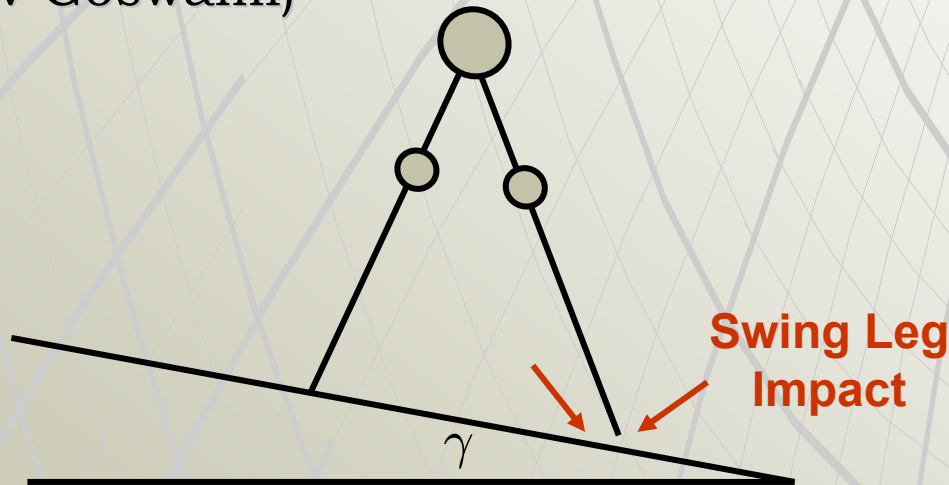


# Discrete Foot Impact



## ❖ Impact Equations (swing leg impact on ground):

- ❑ Angle positions preserved
- ❑ Discontinuity in angle velocity (different ways of modeling, Grizzle v Goswami)



## ❖ Transition Map (hybrid system reset)

- ❑ Swing leg becomes stance leg: angle positions swap
- ❑ Angle velocities:  $\Theta^+ = H(\gamma) \Theta^-$



# Lagrangian Formulation



- ❖ The Lagrangian formulation accounts for all energy in the system

- ❖ Lagrangian = Kinetic Energy – Potential Energy

$$L = K - V$$

$$L = \frac{1}{2} \Theta'^T M(\Theta) \Theta' - \int q(\Theta)$$

- ❖ Derive the continuous Equations of Motion (passive):

$$M(\Theta) \Theta'' + F(\Theta, \Theta') \Theta' + q(\Theta) = \mathbf{0}$$

where  $\Theta = [\Theta_{ns}, \Theta_s, \Phi_{ns}, \Phi_s]^T$

- ❖ M and F are 4x4 matrices and q is a 4x1 vector

- ❖ Pages and pages of matrix entries!



# Dependency Simplification



❖ Goal is to find cyclic variables in Lagrangian

Strategies:

- ❖ Fixing inner angle  $2\gamma \Rightarrow$  No cyclic variables
- ❖ Limit as  $M/m$  approaches infinity  $\Rightarrow$  No cyclic
- ❖ Limit as  $b/a$  approaches infinity  $\Rightarrow$  No cyclic
- ❖ Fixing  $\Phi_s[t] = \Phi_{ns}[t]$  (x-y plane)
  - *Two* cyclic variables:  $\Phi_{ns}[t]$  and  $\Phi_s[t]$

$M[\Theta] =$

**M1**

$\beta^2$	$-\beta (1 + \beta) \text{Cos}[\phi_{ns}[t] - \phi_s[t]]$
$-\beta (1 + \beta) \text{Cos}[\phi_{ns}[t] - \phi_s[t]]$	$1 + (1 + \beta)^2 (1 + \mu)$
0	0
0	0

0	0
0	0
$\beta^2 \text{Sin}[\phi_{ns}[t]]^2$	$-\beta (1 + \beta) \text{Sin}[\phi_{ns}[t]] \text{Sin}[\phi_s[t]]$
$-\beta (1 + \beta) \text{Sin}[\phi_{ns}[t]] \text{Sin}[\phi_s[t]]$	$(1 + (1 + \beta)^2 (1 + \mu)) \text{Sin}[\phi_s[t]]^2$

**M2**



# Routhian Reduction



❖  $\Phi_{ns}[t]$  and  $\Phi_s[t]$  independent

❖  $M_2(\Theta) \dot{\Phi} = \mathbf{c}$  (Routhian constant)

where  $\dot{\Phi} = [ \dot{\Phi}_{ns}, \dot{\Phi}_s ]^T$ ,

$\Theta = [ \Theta_{ns}, \Theta_s ]^T$ ,

$\mathbf{c} = [ c_1, c_2 ]^T$

and  $\dot{\Phi}_{ns}[t] = \dot{\Phi}_s[t]$

❖ Solve:  $\dot{\Phi} = \mathbf{c}/m(\Theta)$

❖ Routhian =  $[ L(\Theta, \dot{\Theta}, \dot{\Phi}) - \mathbf{c} \dot{\Phi} ]_{\dot{\Phi}=\mathbf{c}/m(\Theta)}$

Augmented Term

$$R = \frac{1}{2} \dot{\Theta}^T M_1(\Theta) \dot{\Theta} - \int q(\Theta) - \frac{1}{2} \mathbf{c}^2 / m(\Theta)$$



# Results of Reduction



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# Reduced Model



- ❖ Continuous Equations of Motion (passive):

$$M(\Theta) \ddot{\Theta} + F(\Theta, \dot{\Theta}) \dot{\Theta} + q(\Theta) + \text{aug}_c(\Theta) = \mathbf{0}$$

where  $\Theta = [ \Theta_{ns}, \Theta_s ]^T$

Original 2D Model

Augmented Potential

Conclusions:

- ❖ M and F are 2x2 matrices; q and aug are 2x1 vectors
- ❖ The reduced model (now 2D) is equivalent to the original 2D model with an augmented term
- ❖ Matrices M and F and vector q remain the same; overall potential term is modified.
- ❖ Additional constant c (if zero => original 2D model)
- ❖ Uniqueness: Trivial to bring back to unique 3D model



# Normalized Eqns of Motion (2D)



$$M(\Theta) =$$

$$\begin{pmatrix} \beta^2 & -\beta (1 + \beta) \cos[\phi_{ns}[t] - \phi_s[t]] \\ -\beta (1 + \beta) \cos[\phi_{ns}[t] - \phi_s[t]] & 1 + (1 + \beta)^2 (1 + \mu) \end{pmatrix}$$

$$F(\Theta, \Theta') =$$

$$\begin{pmatrix} 0 & -\beta (1 + \beta) \sin[\phi_{ns}[t] - \phi_s[t]] \phi_s'[t] \\ \beta (1 + \beta) \sin[\phi_{ns}[t] - \phi_s[t]] \phi_{ns}'[t] & 0 \end{pmatrix}$$

$$q(\Theta) = \begin{pmatrix} g \beta \sin[\phi_{ns}[t]] \\ -g (1 + (1 + \beta) (1 + \mu)) \sin[\phi_s[t]] \end{pmatrix}$$

$$-aug_c(\Theta) =$$

$$\begin{pmatrix} \frac{c^2 \beta \cos[\phi_{ns}[t]] (\beta \sin[\phi_{ns}[t]] - (1 + \beta) \sin[\phi_s[t]])}{(\beta^2 \sin[\phi_{ns}[t]]^2 - 2 \beta (1 + \beta) \sin[\phi_{ns}[t]] \sin[\phi_s[t]] + (1 + (1 + \beta)^2 (1 + \mu)) \sin[\phi_s[t]]^2)^2} \\ \frac{c^2 \cos[\phi_s[t]] ((-1 - \beta) \beta \sin[\phi_{ns}[t]] + (1 + (1 + \beta)^2 (1 + \mu)) \sin[\phi_s[t]])}{(\beta^2 \sin[\phi_{ns}[t]]^2 - 2 \beta (1 + \beta) \sin[\phi_{ns}[t]] \sin[\phi_s[t]] + (1 + (1 + \beta)^2 (1 + \mu)) \sin[\phi_s[t]]^2)^2} \end{pmatrix}$$





# Hypothesis of 3D Motion



- ❖ Current reduced model is in 2D, but can easily bring into 3D using the property of Routhian reduction

$$\dot{\Phi} = M_2^{-1}(\Theta) \mathbf{c},$$

$$\Phi = \Phi_0 + \int M_2^{-1}(\Theta) \mathbf{c}$$

- ❖ Hypothesis of Reduced 3D Motion: If stable limit cycles exist for the reduced model in two dimensions, then stable limit cycles also exist for the three dimensional version of the reduced model
- ❖ We will be conducting tests with Simon Ng's HyVisual implementation to confirm this hypothesis



# Final Thoughts



- ❖ A 3D biped model is related to its much simpler 2D model by a computable term
- ❖ The 3D model is thus easily implemented in a visual simulation, which is useful for confirming results
- ❖ The final outcome of this project is a general framework by which previously established techniques can be applied to three dimensional bipeds

