# Inverse Dynamics

MCEN 4/5228

Modeling of Human Movement

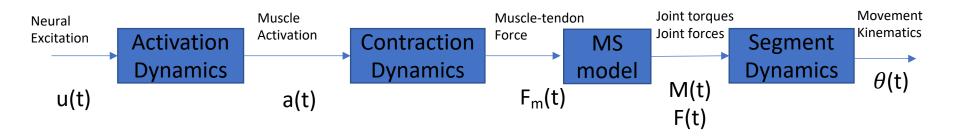
Fall 2021

### Inverse Dynamics

- Forward vs Inverse Dynamics
- Measuring ground reaction forces
- Center of pressure
- Inverse dynamics example
- Inverse dynamics without ground reaction forces
- Clinical application

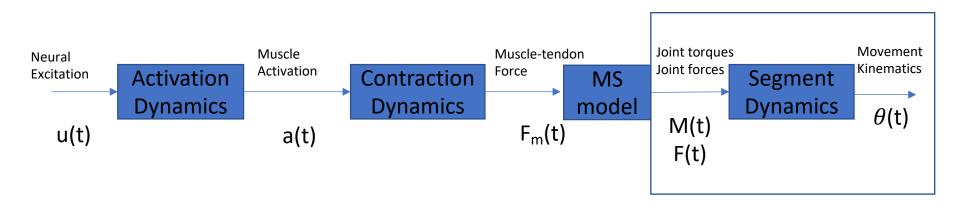
## Modeling pipeline

- Activation Dynamics
- Contraction Dynamics
  - F-L
  - F-V
  - Tendon F-L
- MS model
  - Muscle moment arms
- Segment Dynamics
  - Equations of motion



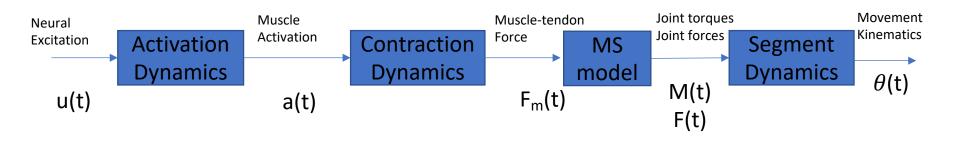
### Forward and inverse dynamics

- Forward dynamics: process of predicting motion that would result from applying a given set of forces and torques on a system (→)
- Inverse dynamics: process of determining joint forces and torques given kinematics ( ←)



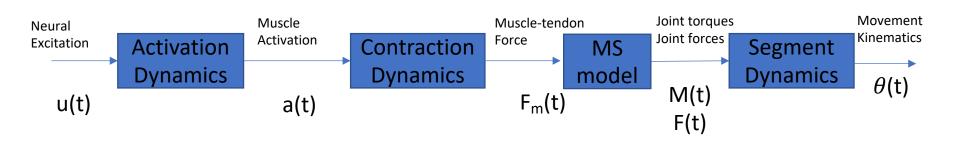
## Applications of Inverse Dynamics

- Estimation of joint loads for injury prevention and rehabilitation
- Estimation of muscle forces (with an additional step)



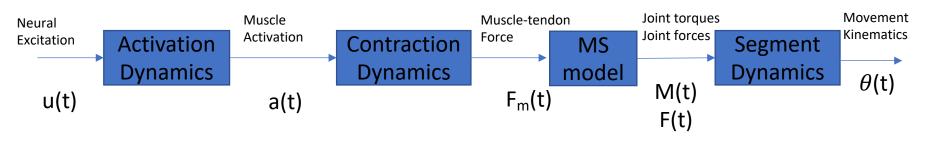
### Limitations of Inverse Dynamics

- Model assumptions
- Noisy experimental data
- Does not provide information about individual muscles



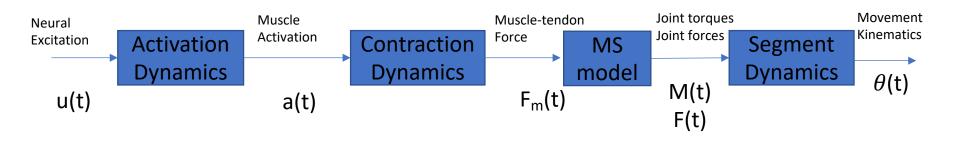
## Applications of forward dynamics

- Understanding muscle function
- Determining individual muscle contributions to:
  - Segment accelerations
  - Joint loads
  - Metabolic cost
  - Performance
- Assessing performance
  - Max jump height



## Limitations of forward dynamics

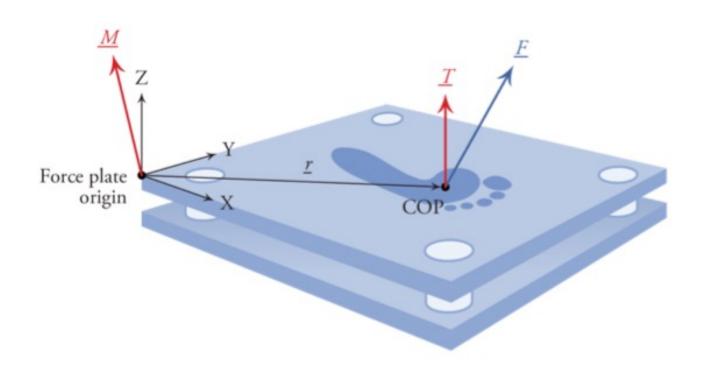
- Difficult to produce a well-coordinated movement
  - Optimal tracking
    - Minimize RMS error between experiment and model
  - Hypothesize goal of the motor task
  - There is no unique solution
    - Muscle recruitment is not trivial
  - Validation can be difficult



# Solving inverse dynamics problems

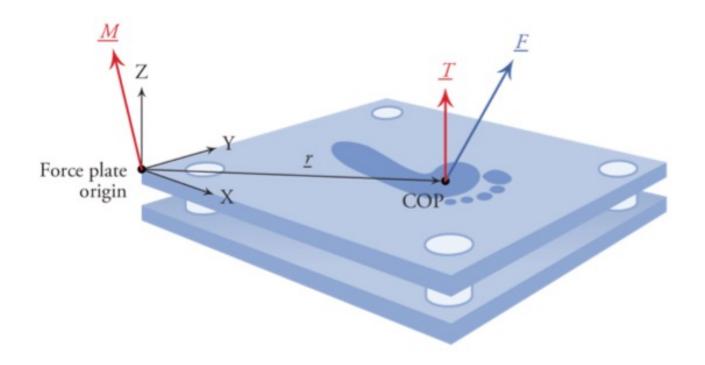
- Many different approaches
- Typical approach described here
  - Use ground reaction forces if they are available
  - Derive equations of motion
  - Describe algorithm to determine net joint forces and torques

## Measuring ground reaction forces

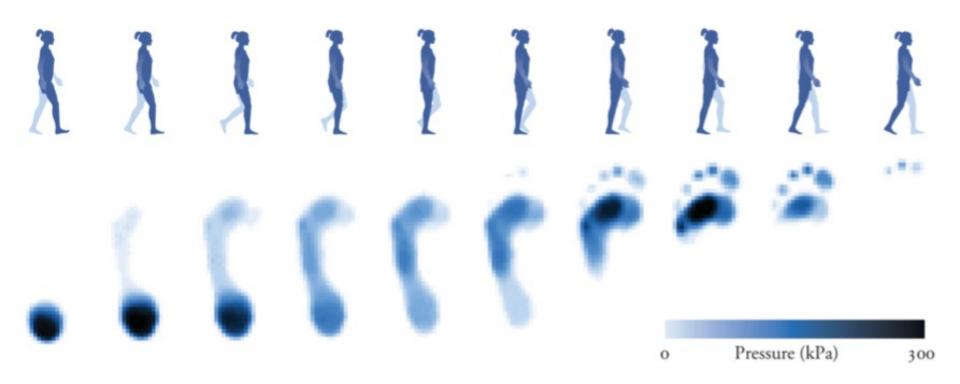


### Force plate

- Measures ground reaction forces (GRFs)
  - Resultant force, F and total moment M

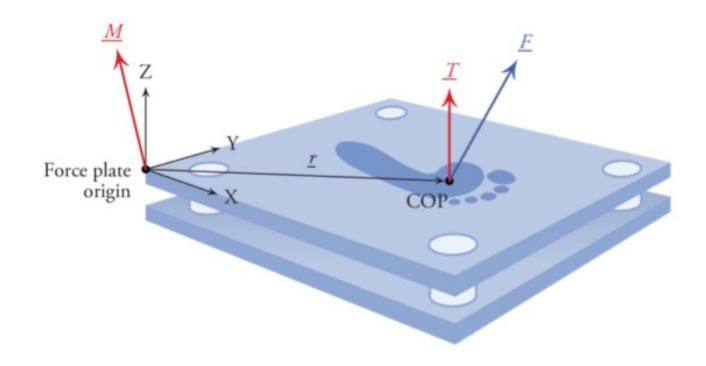


### Center of pressure



### Force plate

- Measures ground reaction forces (GRFs)
  - Resultant force, F and total moment M
  - Used to calculate center of pressure, COP, and free moment, T



### Center of pressure

- Center of pressure (COP)
  - Location at which the GRF would be applied if the pressure distributed over the sole of the foot were concentrated at a point

$$\underline{M} = \underline{r} \times \underline{F} + \underline{T}$$

- M: moment at FP origin
- r: vector from the origin to the COP
- F: resultant ground reaction force
- T : equivalent torque applied at the COP

### Center of pressure equations

$$\underline{M} = \underline{r} \times \underline{F} + \underline{T}$$

- 3 equations  $(M_{x,y,z})$  but 6 unknowns  $(r_{x,y,z}, T_{x,y,z})$
- $r_7$  = 0: COP remains on the force plate
- $T_x$  and  $T_y$  = 0: surface friction can only generate moment about the vertical axis

$$\underline{r} = \begin{cases} -M_y / F_z \\ M_x / F_z \\ 0 \end{cases}$$

$$T_z = M_z - r_x F_y + r_y F_x$$

### Inverse dynamics algorithm

### • Given:

- a representative computational model of a subject
- The subject's joint kinematics over time
- measurements of the external forces applied to the subject

### • Find:

 the net joint forces and torques that must have been present to produce the given motion

## Inverse dynamics (ID) algorithm

#### • Given:

- a representative computational model of a subject
- the subject's joint kinematics over time
- measurements of the external forces applied to the subject

#### • Find:

• the net joint forces and torques that must have been present to produce the given motion

Apply laws of mechanics to each body segment in the model and compute the internal forces and torques acting at each joint.

#### Comments:

- Joint angles often estimated from optical marker trajectories using an IK algorithm, then smoothed and differentiated to obtain angular velocities and accelerations.
- Possible to perform ID analysis without measurements of external forces.

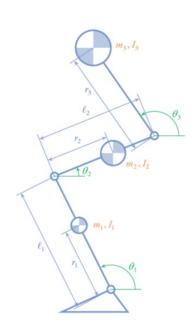
## Example: ID during the squat

- Experimental setup and approximate sagittal plane model
- Planar model of a two-legged squat:
  - 4 rigid bodies connected by three pin joints (ankle,knee,hip)
  - symmetric
  - foot has negligible mass
  - lump left and right segments
  - lump head arms torso: HAT
  - model is scaled to subject

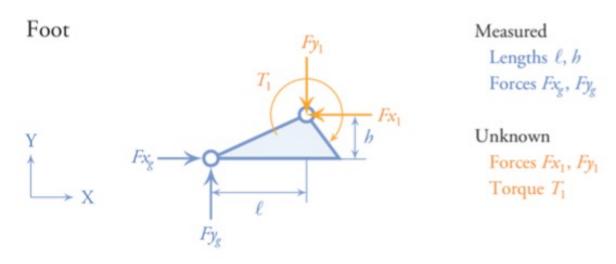
### • Approach:

 begin at feet and use a sequence of free body diagrams to compute net forces and torques applied at Each joint



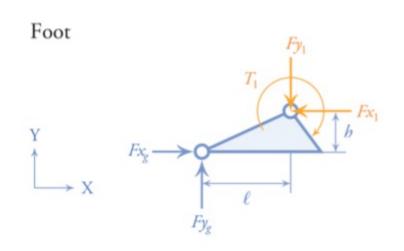


### Foot segment



- Newton's third law of motion
  - Convention: draw vectors in the positive direction on the proximal body and in the negative direction on the distal body.

### Foot segment



Measured

Lengths  $\ell$ , hForces  $Fx_{\ell}$ ,  $Fy_{\ell}$ 

Unknown

Forces  $Fx_1$ ,  $Fy_1$ Torque  $T_1$ 

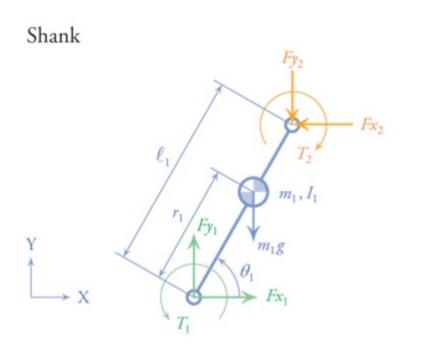
$$\sum M^{k} = I_{b} \ddot{\theta}_{b} + \underline{r}^{k} \times m_{b} \underline{a}_{b}$$

$$\sum F_{\mathbf{X}} = m_0 \ddot{x}_0 \qquad \sum F_{\mathbf{Y}} = m_0 \ddot{y}_0 \qquad \sum M^A = 0$$

$$Fx_g - Fx_1 = 0 \qquad Fy_g - Fy_1 = 0 \qquad Fx_g h - Fy_g l - T_1 = 0$$

$$Fx_1 = Fx_g \qquad \boxed{Fy_1 = Fy_g} \qquad \boxed{T_1 = Fx_g h - Fy_g l}$$

## Shank segment



Lengths  $\ell_1$ ,  $r_1$ Orientation  $\theta_1$ Mass  $m_1$ 

Inertia  $I_1$ 

Already computed Forces  $Fx_1$ ,  $Fy_1$ Torque  $T_1$ 

Unknown

Forces  $Fx_2$ ,  $Fy_2$ Torque  $T_2$ 

$$x_1 = r_1 c \theta_1$$

 $\dot{x}_1 = -r_1 \mathbf{s} \, \theta_1 \dot{\theta}_1$ 

 $\ddot{x}_1 = -r_1 \left( s \, \theta_1 \ddot{\theta}_1 + c \, \theta_1 \dot{\theta}_1^2 \right)$ 

$$y_1 = r_1 \mathbf{s} \, \theta_1$$

$$\dot{y}_1 = r_1 c \,\theta_1 \dot{\theta}_1$$

$$\ddot{y}_1 = r_1 \left( c \, \theta_1 \ddot{\theta}_1 - s \, \theta_1 \dot{\theta}_1^2 \right)$$

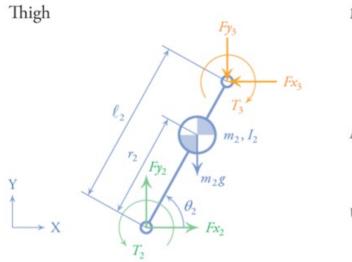
$$Fx_1 - Fx_2 = -m_1 r_1 \left( s \,\theta_1 \ddot{\theta}_1 + c \,\theta_1 \dot{\theta}_1^2 \right)$$

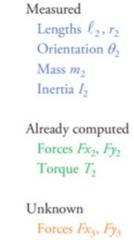
$$Fy_1 - Fy_2 - m_1g = m_1r_1\left(c\theta_1\ddot{\theta}_1 - s\theta_1\dot{\theta}_1^2\right)$$

$$T_1 - T_2 + Fx_1r_1s\theta_1 - Fy_1r_1c\theta_1 + Fx_2d_1s\theta_1 - Fy_2d_1c\theta_1 = I_1\theta_1$$

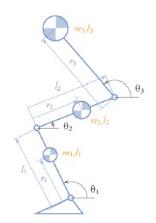
$$d_1 \equiv l_1 - r_1$$

### Thigh segment



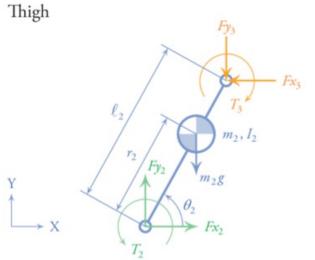


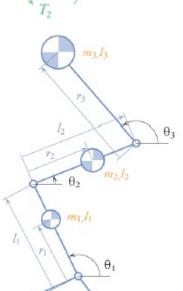
Torque  $T_3$ 



Need: 
$$X_2, \dot{X}_2, \ddot{X}_2$$
  
 $Y_2, \dot{Y}_2, \ddot{Y}_2$ 

### Thigh segment





Measured
Lengths  $\ell_2$ ,  $r_2$ Orientation  $\theta_2$ Mass  $m_2$ Inertia  $I_2$ 

Already computed Forces  $Fx_2$ ,  $Fy_2$ Torque  $T_2$ 

Unknown Forces  $Fx_3$ ,  $Fy_3$ Torque  $T_3$ 

$$x_{2} = l_{1}c \theta_{1} + r_{2}c \theta_{2}$$

$$\dot{x}_{2} = -l_{1}s \theta_{1}\dot{\theta}_{1} - r_{2}s \theta_{2}\dot{\theta}_{2}$$

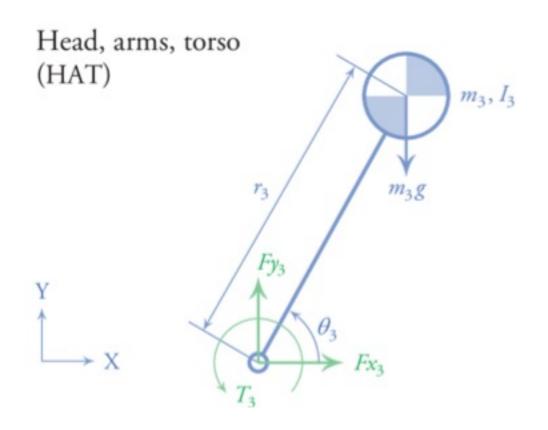
$$\ddot{x}_{2} = -l_{1}\left(s \theta_{1}\ddot{\theta}_{1} + c \theta_{1}\dot{\theta}_{1}^{2}\right) - r_{2}\left(s \theta_{2}\ddot{\theta}_{2} + c \theta_{2}\dot{\theta}_{2}^{2}\right)$$

$$y_{2} = l_{1}s \theta_{1} + r_{2}s \theta_{2}$$

$$\dot{y}_{2} = l_{1}c \theta_{1}\dot{\theta}_{1} + r_{2}c \theta_{2}\dot{\theta}_{2}$$

$$\ddot{y}_{2} = l_{1}(c \theta_{1}\ddot{\theta}_{1} - s \theta_{1}\dot{\theta}_{1}^{2}) + r_{2}\left(c \theta_{2}\ddot{\theta}_{2} - s \theta_{2}\dot{\theta}_{2}^{2}\right)$$

### HAT segment



#### Measured

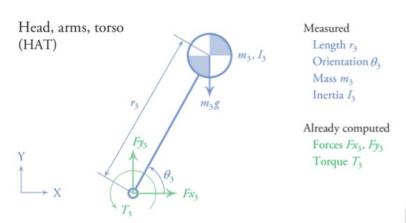
Length  $r_3$ Orientation  $\theta_3$ Mass  $m_3$ Inertia  $I_3$ 

### Already computed

Forces  $Fx_3$ ,  $Fy_3$ Torque  $T_3$ 

### ID without GRFs

- If GRFs are unknown, we have 5 unknowns in the dynamic equations from the foot:  $Fx_1, Fy_1, T_1, Fx_g, Fy_g$
- Undetermined system and need additional info
- One solution: replace foot dynamic equations with dynamic equations from HAT



$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ r_3 \circ \theta_3 & -r_3 \circ \theta_3 & 1 \end{bmatrix} \begin{bmatrix} Fx_3 \\ Fy_3 \\ T_3 \end{bmatrix} = \begin{bmatrix} m_3 \ddot{x}_3 \\ m_3 \ddot{y}_3 + m_3 g \\ I_3 \ddot{\theta}_3 \end{bmatrix}$$

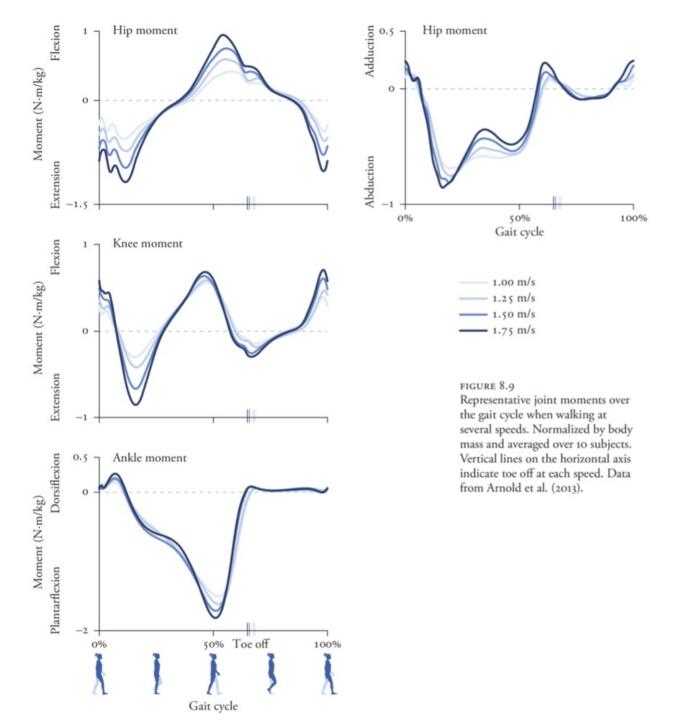
## Verifying dynamic consistency

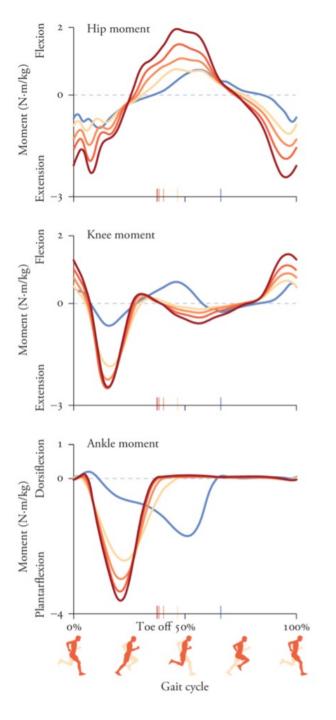
- What if we were equally confident in both the GRFs and the HAT segment kinematics?
  - →overdetermined system (more equations than unknowns)
  - → use extra information to improve the model parameters
  - → Can begin at foot segment and use the equations to obtain hip forces and torques, and then apply those forces to the HAT to predict linear and angular accelerations and compare to measured kinematics

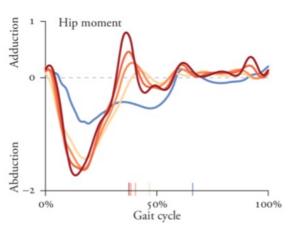
$$\hat{x}_{3} = \frac{1}{m_{3}} F x_{3}$$

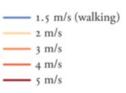
$$\hat{y}_{3} = \frac{1}{m_{3}} F y_{3} - g$$

$$\hat{\theta}_{3} = \frac{1}{I_{3}} (F x_{3} r_{3} s \theta_{3} - F y_{3} r_{3} c \theta_{3} + T_{3})$$









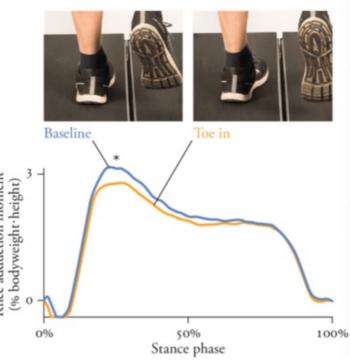
Representative joint moments over the gait cycle when running at several speeds (walking at 1.5 m/s from Figure 8.9 is shown for reference). Normalized by body mass and averaged over 10 subjects. Vertical lines on the horizontal axis indicate toe off at each speed. Data from Hamner and Delp (2013).

# Application: gait retraining to reduce knee pain

- Knee osteoarthritis (OA) affects about 20% of adults over the age of 45
- Analysis of knee dynamics can help us understand how OA develops and how best to treat it

# Application: gait retraining to reduce knee pain





GRF generates an external knee adduction moment during stance

Moment loads medial compartment of the knee, leading to it supporting 2-3x more weight than the lateral compartment

Peak occurs in early stance and is linked to presence, severity and progression of medial compartment OA

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