

A Neuromechanical Model of Reduced Dorsiflexor Torque During the Anticipatory Postural Adjustments of Gait Initiation

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Abstract—Anticipatory postural adjustments (APAs) precede gait initiation and function to accelerate the center of mass forward and towards the initial stance leg. Impairments in APA generation, such as those seen in people with Parkinson's disease (PD), can impact the quality of the first step. An initial burst of activity in the dorsiflexor muscle (tibialis anterior) of the stepping leg is an important contributor to the posterior excursion of the center of pressure that accelerates the center of mass forward during an APA. Tibialis anterior activation can be diminished or absent in people with PD; however, the neuromechanical consequence of this diminished dorsiflexor torque on APA generation is not fully understood. Computational models of gait initiation that include components of the neuromuscular system may provide additional insight. In this paper, an inverted pendulum model of the body generated from healthy young adult data was used to simulate reduced dorsiflexor torque during an APA for gait initiation. Forward body lean angle and center of pressure were assessed over various settings of decreased dorsiflexor torque and compared to experimental data from a person with PD. Results from the model demonstrate that reducing the peak dorsiflexor torque by as little as 8-Nm may alter forward body lean and the center of pressure excursion from their nominal trajectories. These results can help inform how much torque is needed from an external device to effectively modulate APAs for gait initiation, as well as provide insight into compensation strategies for reduced dorsiflexor torque in pathology.

Index Terms—Computational modeling, anticipatory postural adjustments, Parkinson's disease.

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I. INTRODUCTION

GAIT initiation is preceded and accompanied by a sequence of anticipatory postural adjustments (APAs) that function to accelerate the body forward and laterally toward the initial stance leg prior to the first step [1]–[3]. An APA starts with a reciprocal increase and decrease in the vertical ground reaction forces underneath the stepping and stance legs respectively, and excursion of the center of pressure backwards and laterally towards the stepping limb. The stereotypical sequence of muscle activations that accompany this phase includes an initial deactivation of plantarflexor muscles (gastrocnemius and soleus) and activation of the dorsiflexor muscle (tibialis anterior) of both the stepping and stance legs [1]–[3]. The magnitude of the initial tibialis anterior (TA) burst of the stepping leg and posterior center of pressure excursion have been shown to be highly correlated with gait initiation velocity [2], [4]. After this initial phase of an APA, forces are generated by the plantarflexor muscles of the stepping leg to accelerate the center of mass towards the stance foot and forward. Lastly, the dorsiflexor muscle (tibialis anterior) of the stepping leg is activated to lift the stepping leg off the ground for the first step [1]–[3]. Alteration in the timing or magnitude of this sequence can have detrimental effects on postural stability and the execution of the first step.

Impaired capacity to generate APAs during gait initiation has been reported in a variety of neurological disorders. One of the best characterized examples of APA impairment is in people with Parkinson's disease (PD). A variety of studies have shown that ground reaction forces and center of pressure shifts during self-initiated forward stepping are diminished in magnitude and prolonged in duration when participants are in the off-medication state [5]–[8]. The initial TA burst of the stepping leg can often be diminished or absent, resulting in a decreased excursion of the center of pressure in the sagittal plane, reduced dorsiflexor torque, and slower gait initiation velocity [5]–[7]. However, the neuromechanical significance of this behavior has yet to be fully understood. Some have proposed that the decreased center of pressure excursion may be a way of maintaining stability by reducing the forward acceleration of the center of mass relative to the base of support [9]. On the other hand, diminished TA activation

could also be due to impairment in muscle recruitment caused by dysfunction of the basal ganglia in PD [10], [11]. For instance, the inability to appropriately scale muscle activation to intended movement amplitude has been observed in PD [11]. A model of diminished TA activation during gait initiation could be utilized to better understand its neuromechanical significance and guide the development of modulation strategies for gait initiation in persons with PD (e.g., cues or externally applied mechanical assistance).

Currently, no computational models exist for how deficits in dorsiflexion might affect gait initiation. Inverted pendulum models have been widely used for studying upright standing postural control [12]–[14], including for persons with PD [15]. These models contain terms that effectively model the physiology of the human body, including the neuromuscular system (e.g., sensory feedback, neural controller). Inverted pendulum models have also been used to calculate the mechanics of gait initiation in healthy individuals [4], [16]. However, these gait initiation models do not include elements specifically related to the neuromuscular system. In this study, we aimed to utilize the neuromuscular components of postural control inverted pendulum models to effectively model an APA for gait initiation in persons with PD using healthy young adult data. We also aimed to investigate the neuromechanical consequences of reduced dorsiflexor torque on overall forward body progression and anterior-posterior excursion of the body's total center of pressure. The model was then compared to experimental data from a person with PD.

II. METHODS

A. Experimental Data

The model was defined using ten self-initiated (uncued) trials from a healthy young adult participant (male, age 30, ht 180 cm, wt 86 kg). These data were compared to seven self-initiated trials of an individual with PD (male, age 65, ht. 168 cm, wt. 77 kg). The individual with PD was tested after a 12-hr. withdrawal from Parkinson's medication (i.e., levodopa). Participants stood on two force platforms (AMTI, Watertown, MA at UIUC and Kistler Instrument Corporation, Novi, MI, at UMN) and were instructed to initiate gait. To ensure that the participants did not step in response to the ready tone the young healthy participant was asked to initiate gait starting with the right foot approximately 3-5 seconds after hearing the tone (80 dB, 1 kHz). Similar instructions were given to the individual with PD except for he was asked to initiate gait with his left foot 3-8 seconds after hearing the verbal command "anytime." If the person did not wait enough time after the ready tone (or verbal command), the trial was redone. Ground reaction forces and moments were collected at 1000 Hz in both cases and full body kinematic data were collected using motion capture systems (Qualisys North America, Inc., Buffalo Grove, Illinois, USA, Simi Motion Systems, GmbH, Unterschleissheim, Germany) at 200 Hz (healthy individual) and 120 Hz (individual with PD). All data collection and procedures were approved by the University of Illinois at Urbana-Champaign and the University of Minnesota Institutional Review Boards (IRBs).

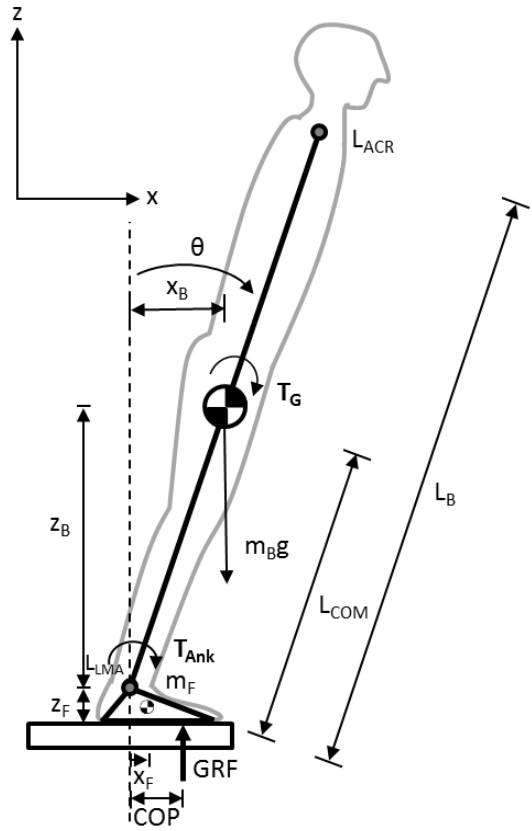


Fig. 1. Inverted pendulum model. List of terms: L_{ACR} left acromion marker, L_{LMA} left lateral malleolus marker, θ forward body lean angle, x_B horizontal position of the body center of mass, m_B the mass of the body without the feet, L_B length of the body, L_{COM} length of the body up to the center of mass, z_B vertical position of the body center of mass, m_F mass of the foot, z_F height of the ankle joint, x_F horizontal position of the center of mass of the foot, COP position of center of pressure, GRF vertical ground reaction force, T_{Ank} applied ankle torque generated by the neuromuscular system, and T_G torque due to gravity of body segment. The reaction forces at the ankle joint (R_x and R_z) are not pictured.

B. Model Definition

To study the effects of reduced dorsiflexor torque, the upright body during gait initiation was modeled as a single-link inverted pendulum in the sagittal plane (Fig. 1). It was assumed that both ankles pivoted around the same point and the feet were anchored to the ground [4]. The equations of motion for the body segment pivoting around the ankles were:

$$\sum F_x = R_x(t) = m_B a_{Bx}(t) \quad (1)$$

$$\sum F_z = R_z(t) - m_B g = m_B a_{Bz}(t) \quad (2)$$

$$\sum T = T_{Ank}(t) + T_G(t) = J_B \ddot{\theta}(t) \quad (3)$$

where R_x and R_z were the reaction forces at the ankle joint, m_B was the body mass (excluding the feet), a_{Bx} was the acceleration of the body segment in the horizontal direction, a_{Bz} was the acceleration of the body in the vertical direction, g was acceleration due to gravity, $J_B = \frac{1}{3} m_B L_B^2$ was the moment of inertia about the ankles (under the assumption of the body being a uniform rod), and L_B was the body length. L_B was defined as the Euclidian distance between motion

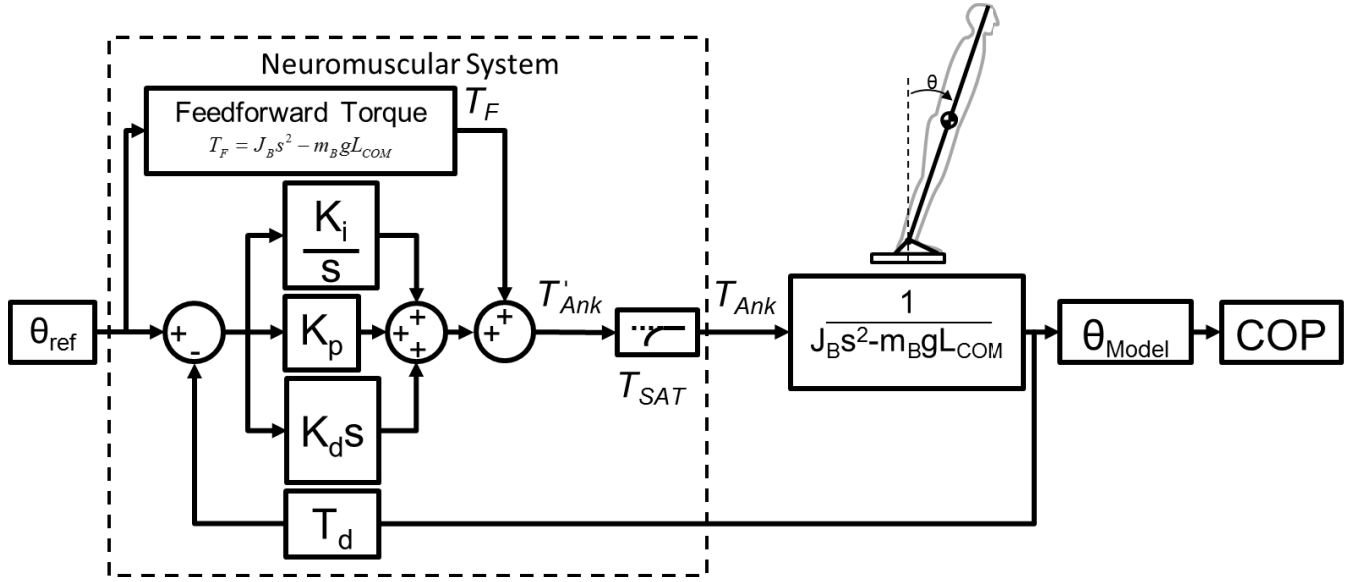


Fig. 2. Block diagram of inverted pendulum model of gait initiation.

capture markers placed on the left acromion (shoulder, L_{ACR}) and lateral malleolus (ankle, L_{LMA}) of the healthy young adult participant. T_{Ank} was the torque applied at the ankle by the person (plantarflexor defined as positive), and T_G was the torque due to gravity of the body. Body lean angle (θ) and torque due to gravity (T_G) were calculated using equations 4 and 5:

$$\theta(t) = -\left(\arctan(L_{ACRz} - L_{LMAz}, L_{ACRx} - L_{LMAx}) - \frac{\pi}{2}\right) \quad (4)$$

$$T_G(t) = m_B g L_{COM} \sin \theta(t) \approx m_B g L_{COM} \theta(t) \quad (5)$$

where L_{ACRx} , L_{LMAx} , L_{ACRz} , L_{LMAz} were the horizontal and vertical positions of the motion capture markers placed on the left acromion and lateral malleolus, and L_{COM} was the position of the center of mass (assumed to be half of L_B because the pendulum was assumed to be a uniform rod). Small angle approximation was used for equation 5. The transfer function from applied ankle torque (T_{Ank}) to body lean angle (θ_{Model}) in the Laplace domain was derived from equation 3:

$$\frac{\theta_{Model}(s)}{T_{Ank}(s)} = \frac{1}{J_B s^2 - m_B g L_{COM}} \quad (6)$$

C. Neuromuscular Terms

Multiple terms related to the neuromuscular system were included in the model in order to calculate T_{Ank} (Fig 2). First a feed-forward ankle torque (T_F) was calculated based on solving equation 3 for T_{Ank} and setting it equal to T_F :

$$T_F(t) = J_B \ddot{\theta}_{ref}(t) - m_B g L_{COM} \theta_{ref}(t) \quad (7)$$

The nominal trajectory (θ_{ref}) was generated using equation 4 from the average behavior of 10 self-initiated gait initiation trials (right foot steps) from the healthy test participant. Several experimental studies and computational models have demonstrated that the nervous system develops a predictive

feedforward model for movements that can make online corrections with delayed sensory feedback within a neural circuit that involves the cerebellum [17], [18].

Similar to postural control inverted pendulum models [13], [15], sensory feedback detecting body lean angle (e.g., vestibular, proprioceptive) was modeled using position feedback (Fig 2). Stiffness (K_p), integrative (K_i), and damping (K_d) feedback gains were included to model corrective torques generated by the neuromuscular system based on sensory feedback. The delay of sensory transmission in the central nervous system was modeled with a time delay block (T_d) of 0.171s [13], [15]. The feedback gains were heuristically tuned to reduce the sum of squared error between experimental (θ_{ref}) and simulated (θ_{Model}) body lean angle data. The sum of four neuromuscular terms equals T'_{Ank} :

$$\begin{aligned} T'_{Ank}(t) = & T_F(t - T_d) + K_p[\theta_{ref}(t - T_d) - \theta_{Model}(t - T_d)] \\ & + K_i \int_0^t [\theta_{ref}(t - T_d) - \theta_{Model}(t - T_d)] dt \\ & + K_d[\dot{\theta}_{ref}(t - T_d) - \dot{\theta}_{Model}(t - T_d)] \end{aligned} \quad (8)$$

Lastly, the maximum amount of dorsiflexor torque available for T_{Ank} was limited using a saturation value (T_{SAT}) defined in equation 9. At each time step, the value of T'_{Ank} was compared to $(T_{DFmax} - T_{SAT})$, where T_{DFmax} was an integer value slightly greater than the maximum experimentally-observed dorsiflexor torque and the value of T_{SAT} was incrementally increased by 2 Nm (starting at 0 Nm). For example, from the experimental data of the pilot test participant, the maximum dorsiflexor torque was -22.3 Nm, then T_{DFmax} could be set to -22 Nm. The resultant value based on equation 9 (T_{Ank}) was fed into the transfer function for the body (equation 6). This saturation procedure effectively modeled the diminished or absent TA activation by the central nervous system in people with PD.

All simulations were performed using Simulink software (MathWorks Inc. Natick, MA).

$$T_{Ank} = \begin{cases} T'_{Ank} & \text{if } T'_{Ank} < (T_{DF\max} - T_{SAT}) \\ (T_{DF\max} - T_{SAT}) & \text{if } T'_{Ank} \geq (T_{DF\max} - T_{SAT}) \end{cases} \quad (9)$$

D. Center of Pressure

Along with body lean angle (θ_{Model}), another biomechanical measurement that has been calculated in other postural control models is the center of pressure (*COP*), or the point at which the total resultant ground reaction force (*GRF*) is acting on the feet, in the sagittal plane [13], [15]. The position of the *COP* was calculated using the following equation derived from the equations of motion for the feet and body:

$$COP(t) = \frac{-J_B \ddot{\theta}_{Model}(t) + m_B g L_{COM} \theta(t) + m_F g x_F - m_B a_{Bz}(t) z_F}{m_B a_{Bz}(t) + m_B g + m_F g} \quad (10)$$

where m_F mass of the feet, z_F height of the ankle joint, x_F horizontal distance between ankle joint and foot center of mass. The last three terms (m_F , z_F , x_F) were based on values for an average adult male used by Maurer and Peterka (2005).

III. RESULTS

Prior to presenting the results, a clarification about the convention used to create the presented plots of T_{Ank} is needed. Dorsiflexor torque was defined as positive within the model for T_{Ank} (equation 8) in accordance with positive theta; however, T_{Ank} was plotted (Figs 3 and 4) with plantarflexor positive to follow the typical biomechanics convention (i.e., extensor moments are presented as positive values).

A. Model Results

With $T_{SAT} = 0$ (no limit on dorsiflexor torque), the model simulation for body lean angle and ankle torque matched the experimental data for the healthy young adult participant (Fig 3). Heuristic tuning of the feedback gains (to minimize the difference between experimental and simulated data) resulted in gain values of $K_p = 1 \text{ Nm} \cdot \text{rad}^{-1}$, $K_i = 194 \text{ Nm} \cdot \text{s}^{-1} \cdot \text{rad}^{-1}$, and $K_d = 10 \text{ Nm} \cdot \text{s} \cdot \text{rad}^{-1}$. Using these gain values, the general behavior for body lean angle was almost identical in the simulation, starting from a slight forward lean of 3.3 degrees progressing to 5.2 degrees at heel-off (Fig 3). Due to a slightly forward lean at the beginning, 33 Nm (of plantarflexor torque) was the initial ankle torque value. As the APA was generated, the model achieved the lowest torque (most dorsiflexor directed) at 22.3 Nm. Finally, the model went into increasing plantarflexor torque before heel-off (Fig 3). The only subtle differences in the simulated ankle torque existed after 0.4 seconds, but the general behavior was the same as the experimental data. Overall, the model was able to accurately simulate the experimental data for body lean angle and ankle torque.

Application of the saturation block ($T_{SAT} \neq 0$) revealed a possible threshold for decreased body lean angle and center of pressure excursion (Fig 4). Limiting the dorsiflexor torque up to 6 Nm ($T_{SAT} \leq 6 \text{ Nm}$) did not result in large differences

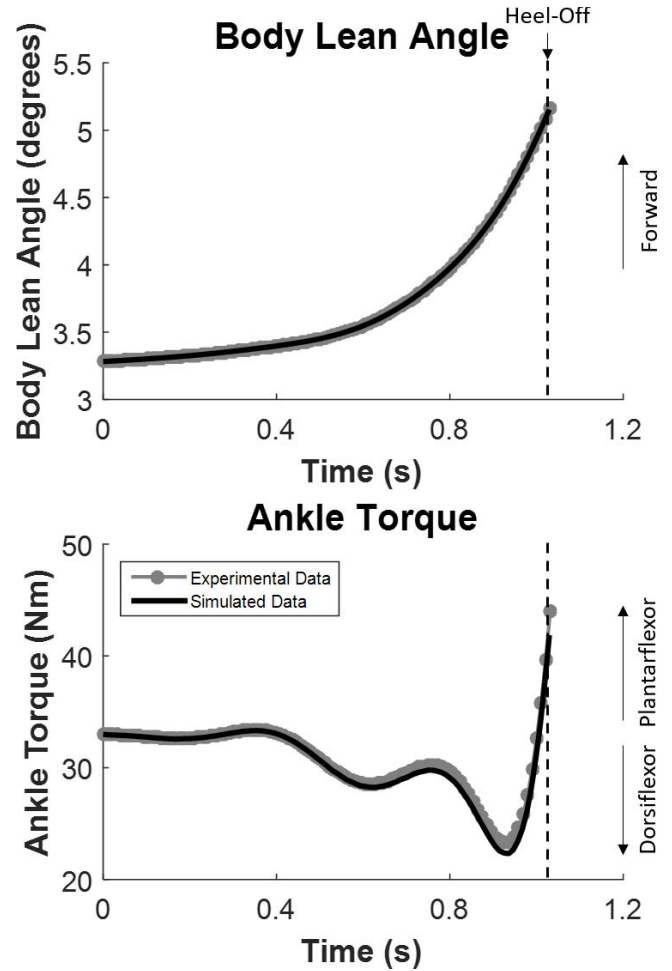


Fig. 3. Body lean angle and ankle torque for simulated and experimental data from the healthy adult participant. Note the simulated data are based on the no-saturation condition ($T_{SAT} = 0$).

in body lean angle or ankle torque. However, when the dorsiflexor torque was limited by 8 Nm, a decrease of body lean angle (0.3°) became apparent and the posterior excursion of center of pressure was decreased by 0.9 cm. When dorsiflexor torque was almost fully limited with a saturation of 10 Nm (33 Nm (starting ankle torque) $- 22.3 \text{ Nm}$ (max dorsiflexor torque) $= 10.7 \text{ Nm}$), the body lean angle was nearly a degree less (0.7°) than the no saturation condition, and the center of pressure excursion was diminished by 1.1 cm. Consequently, reduced dorsiflexor torque resulted in diminished forward progression and decreased posterior excursion of center of pressure.

B. PD Experimental Data Results

The experimental data from the PD participant demonstrated a range of different APA (ankle torque, lean angle, and *COP*) behaviors across the seven trials (Fig 5). These varied results matched well with the behaviors observed in the model predictions. In general, diminished or absent dorsiflexor torque before heel-off, which can be observed by the lack of a downward deflection in the net ankle torque (as demonstrated by the trials highlighted with dashed blue and dotted red lines, respectively), resulted in slower forward progression of the center of mass, increased duration to heel-off, and decreased

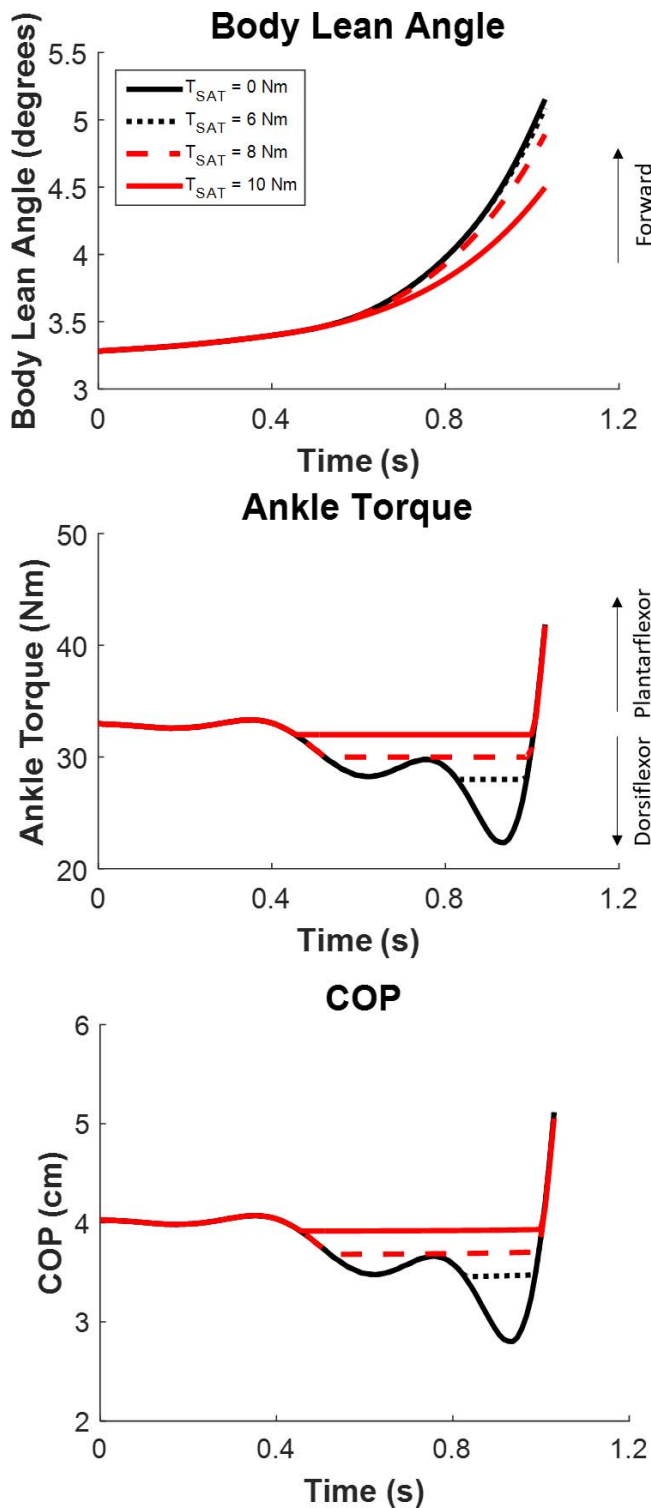


Fig. 4. Simulated body lean angle, ankle torque, and center of pressure (COP) at different dorsiflexor torque saturation values.

posterior COP excursion. When a dorsiflexor torque was generated (as demonstrated by the solid black line trial), the rate of forward progression was faster, and the COP demonstrated a posterior excursion. Note that trials with an increased forward lean at the onset of the APA (as demonstrated by the darker grey lines) were associated with higher initial ankle torques, due to an increased contribution of the gravitation torque

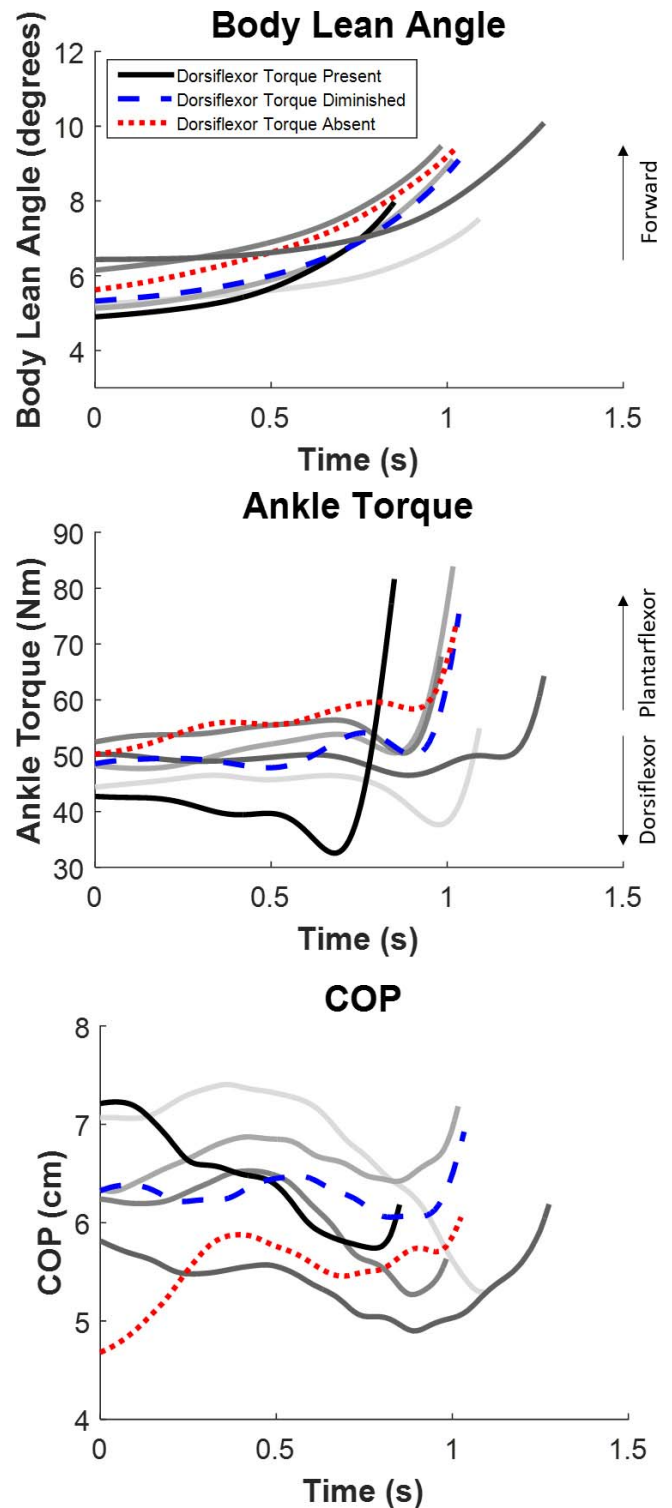


Fig. 5. Experimental data for body lean angle, ankle torque, and COP across all trials for the PD participant ending at heel-off. The sample trials with dorsiflexor torque present (black), diminished (blue), and absent (red) are highlighted. All grey lines are the remaining trials.

about the ankle, and either a markedly diminished or absent dorsiflexor torque during the APA.

IV. DISCUSSION

In this study, an inverted pendulum model of an APA for gait initiation was developed. Furthermore, simulations of

reduced dorsiflexor torque during an APA were performed. The findings highlight the possible consequences of dorsiflexor torque limitations, including diminished forward progression and posterior excursion of the center of pressure (Fig 4). Specifically, limiting the dorsiflexor torque up to 6 Nm did not result in large differences in forward body lean angle or center of pressure excursion. However, limiting the dorsiflexor torque by 10 Nm resulted in a reduced forward body lean angle and center of pressure excursion similar to the APA profile observed in an individual with PD (Fig 5). Furthermore, the PD experimental data demonstrated that changes in the initial body lean angle may alter the magnitude and profile of the ankle torque. Ultimately, this APA model provides an initial basis for understanding the neuromechanical factors that may be important for gait initiation modulation paradigms and potential strategies that people with PD use to compensate for reduced dorsiflexor torque.

Without any limitation of dorsiflexor directed torque ($T_{SAT} = 0$), the model was able to simulate the experimental body lean angle of the healthy young adult participant. The combination of feedback gains ($K_p = 1 \text{ Nm}\cdot\text{rad}^{-1}$, $K_i = 194 \text{ Nm}\cdot\text{s}^{-1}\cdot\text{rad}^{-1}$, $K_d = 10 \text{ Nm}\cdot\text{s}\cdot\text{rad}^{-1}$) and the addition of a feedforward torque (T_F) resulted in a low amount of error between experimental and simulated body lean angle and ankle torque profiles. Physiologically, a similar online modification of the feedforward movement command through delayed sensory feedback has been demonstrated in several experimental studies [19]. By comparison to postural control models, our proportional (K_p) and derivative (K_d) gains were smaller and the integrative gain (K_i) was larger. For example, the same three gains in a healthy postural control model were $K_p = 957 \text{ Nm}\cdot\text{rad}^{-1}$, $K_i = 34 \text{ Nm}\cdot\text{s}^{-1}\cdot\text{rad}^{-1}$, and $K_d = 277 \text{ Nm}\cdot\text{s}\cdot\text{rad}^{-1}$ [13]. Another study that only used proportional (K_p) and derivative (K_d) gains were $K_p = 773 \text{ Nm}\cdot\text{rad}^{-1}$ and $K_d = 286 \text{ Nm}\cdot\text{s}\cdot\text{rad}^{-1}$ for healthy individuals and $K_p = 667 \text{ Nm}\cdot\text{rad}^{-1}$ and $K_d = 286 \text{ Nm}\cdot\text{s}\cdot\text{rad}^{-1}$ for people with PD [15]. A key difference between these previous postural control models and the model of this study is the desired movement. For postural control, the reference trajectory is set to zero (no body lean angle) because the goal is to maintain standing posture. Consequently, per the feedforward torque equation for T_F (equation 7), the feedforward torque would also be zero and the movement would be controlled with larger proportional (K_p) and derivative (K_d) gains. In our model, the feedforward torque was able to generate the desired forward body lean (θ_{Ref}) with a small amount of error that accumulated due to the sensory time delay. Thus, a higher amount of integrative gain (K_i) was needed to eliminate the error. The difference in gains between these types of models may suggest that feedback gains are different for postural versus volitional movement. Overall, the APA model of this study was able to track the nominal trajectory with a minimal amount of error due to the inclusion of a feedforward torque.

The simulations of the reduced dorsiflexor torque were also able to reproduce the range of APA behaviors observed in an individual with PD. Trials with reduced dorsiflexor torque were associated with decreased posterior excursion of center of pressure and prolonged time to heel-off.

Interestingly, the simulations suggest that there might be a threshold for decreased dorsiflexor torque before the body lean angle was considerably reduced. Between a 0-6 Nm reduction of dorsiflexor torque, body lean angle at the time of heel-off remained nearly the same as the nominal trajectory. However, when the dorsiflexor torque was limited by 8 Nm, forward body lean angle at heel-off was slightly decreased and the posterior center of pressure excursion was diminished. At 10 Nm of limitation, forward body lean was almost one degree less than the nominal trajectory and the posterior center of pressure excursion was diminished. Furthermore, the behavior of ankle torque remained relatively constant across different values of saturation aside from the dorsiflexor torque limitation (Fig 4). These results suggest that a certain amount of reduced dorsiflexor torque is allowable before it has a considerable effect on forward progression. Moreover, these findings give insight into the amount of external assistance that might be needed during an APA from an ankle torque device (e.g., a powered ankle-foot orthosis) to maintain a desired nominal trajectory for body lean angle and posterior center of pressure excursion.

The implications of a reduced capacity to generate a dorsiflexor torque during the APA were demonstrated in the experimental data obtained in an individual with PD. Trials with a diminished or absent dorsiflexor torque were associated with a relatively large forward lean and more anterior positioning of the center of mass relative to the ankle joint center prior to the APA. This behavior likely reflects a strategy whereby, in the absence of a sufficient dorsiflexor torque, the individual leverages the torque created by the gravitational force to generate the anterior acceleration of the body. The consequence of this strategy is a delayed heel-off, which may require a shortened first step in order to arrest the forward angular momentum of the body. Due to the assumptions of our model, we could not investigate what would happen after heel-off of the stepping foot. Future models would require more degrees of freedom (i.e., hip, knee, and ankle joints) and separated feet. This type of model could further predict the consequences of leaning further forward before the APA on step execution.

Future studies could further utilize the model to design and predict the effects of interventions that restore dorsiflexor torque via increases in strength (e.g., with medications) or by external assistance, such as a powered ankle foot orthosis [20]. For example, oral dopamine replacement therapy and deep brain stimulation have been shown to increase dorsiflexor strength in people with PD [21]. Similarly, medication has been shown to significantly improve the magnitude and timing of APA generation [5]. Accordingly, the model may provide estimates of the amount of dorsiflexor strength increase required to improve gait initiation.

Several limitations of our model should be considered for interpreting the results and developing models of gait initiation in the future. First, only the ankle joint was modeled, so alternative strategies for producing forward body lean through other joints (e.g., the hip joint) were not investigated. For example, a common symptom of PD is a forward body lean around the hip joint. Furthermore, we assumed that all motion

was produced around the ankle joint and the feet did not move through the APA up to heel-off. It is possible that as the model approached heel-off that the model lost approximation of the true behavior of both limbs [4]. Finally, future models could investigate different values of sensory time delay. The time that was used in our model was based on previous postural control models (0.171 s) [13], [15]; however, it is possible that the sensory time delay during gait initiation would be different, especially in response to external assistance. Previous mechanical perturbation studies have demonstrated that adaptations could occur as fast as 88 ms depending on when the perturbation is provided in the APA [22]. Overall, our model provides an initial basis for future studies, but several factors should be considered in the development of APA models.

V. CONCLUSIONS

In conclusion, an inverted pendulum model of an APA was created using neuromuscular components. Moreover, the consequence of reduced dorsiflexor torque in people with PD was simulated. The results suggest that there may be a threshold of diminished dorsiflexor torque that results in diminished forward progression and posterior center of pressure excursion. Future models could investigate the consequences of these diminished APA behaviors to the subsequent step execution phase.

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