

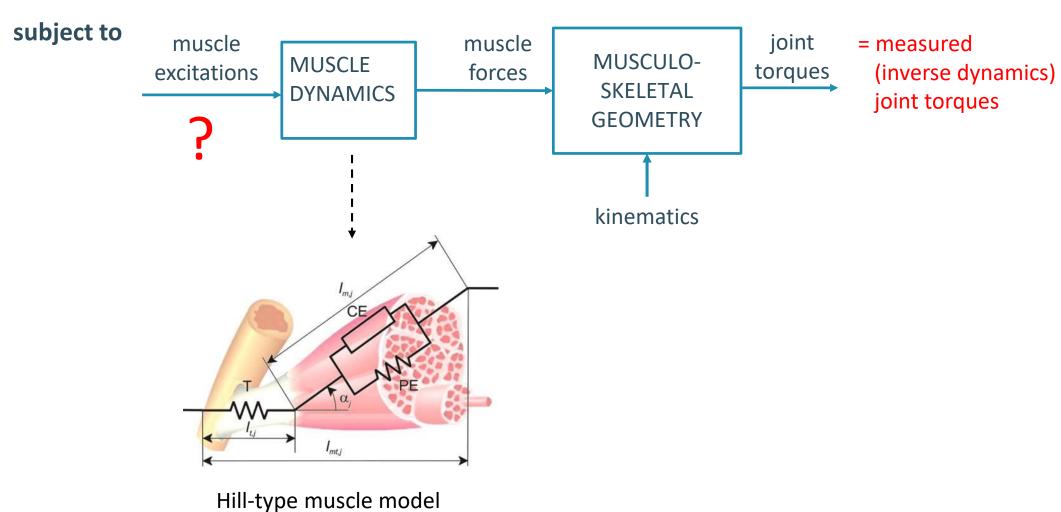
Functionalities

- Input:
 - Processed motion capture data
 - Musculoskeletal model
 - Muscle activity pattern (EMG)
 - Fiber lengths (ultra-sound)
- Solve muscle redundancy problem
- Estimate muscle-tendon parameters
- Perform EMG-driven simulations

optional

Muscle redundancy solver

minimize muscle excitations squared



States and controls

STATES

 $a \rightarrow \text{muscle activations}$ $\tilde{l}_m \rightarrow \text{normalized muscle fiber length}s$

CONTROLS (drive the simulation)

 $e \rightarrow \text{muscle excitations}$

HELPER CONTROLS (added for computational efficiency)

 $a_T \rightarrow$ reserve actuator activation

 $\widetilde{v}_m o \operatorname{derivatie} \operatorname{of} \ \widetilde{l}_m$

Cost function

$$J = wA \cdot \int (e^{2}(t) + a^{2}(t)) + wT_{res} \cdot \int a_{T}^{2}(t) + wEMG \cdot \int (e(t) - \hat{e}(t))^{2} + wl_{M} \cdot \int (l_{M}(t) - \hat{l}_{M}(t))^{2} + wv_{M} \cdot \int v_{M}^{2}(t)$$
(1)
(2)
(3)
(4)
(5)

- (1)Effort
- (2) Reserve actuators
- (3)Tracking measured EMG (optional)
- (4)Tracking measured fiber lenghts (optional)
- (5) Fiber velocities (regularization of NLP)

Constraints

- Activation dynamics: $\dot{a} = f(e, a)$
- Contraction dynamics: $\tilde{v}_m = g(\tilde{l}_m$, a, MT_{params}) with MT_{params} muscle-tendon parameters
- Muscle forces $(F_m = h(\tilde{l}_m, a))$ generate experimental torques (T_{ID}) :
 - $\rightarrow F_m * R = T_{ID}$ (with R muscle moment-arm matrix)

Muscle-tendon parameter estimation

Some of the MT parameters can be estimated

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l_{Mo} \rightarrow optimal fiber length k_T \rightarrow tendon stiffness l_{Ts} \rightarrow tendon slack length
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Other static MT parameters can be adapted in the OpenSim model

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F_{Mo} 
ightarrow 	ext{maximal isometric force} \ alpha_o 
ightarrow 	ext{pennation angle @ } l_{Mo} \ v_{Mmax} 
ightarrow 	ext{maximal contraction velocity}
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Note on overfitting

- Musculoskeletal models typically have many parameters and it might therefore be possible to fit experimental data (EMG and ultrasoundbased fiber length) without accurately estimating the underlying MTparameters.
- Validation of the personalized model is important.
 - Verify that you obtain physiologically plausible muscle activations with the MRS based on the personalized model.
 If not, decrease the number of parameters you are estimating and/or the weight on the data tracking terms in the cost function.
 - Verify (1) that you obtain physiologically plausible muscle activations or (2) that you can reconstruct inverse dynamic joint moments in EMG driven simulation for other movements.

References

Muscle redudancy solver:

De Groote F, Kinney AL, Rao AV, Fregly BJ. Evaluation of Direct Collocation Optimal Control Problem Formulations for Solving the Muscle Redundancy Problem. Ann Biomed Eng. 2016;44(10):2922-2936. doi:10.1007/s10439-016-1591-9

EMG-driven parameter estimation:

Falisse A, Van Rossom S, Jonkers I, De Groote F. EMG-Driven Optimal Estimation of Subject-SPECIFIC Hill Model Muscle-Tendon Parameters of the Knee Joint Actuators. IEEE Trans Biomed Eng. 2017;64(9):2253-2262. doi:10.1109/TBME.2016.2630009

Ultrasound-based parameter estimation:

Delabastita T, Afschrift M, Vanwanseele B, De Groote F. Ultrasound-Based Optimal Parameter Estimation Improves Assessment of Calf Muscle-Tendon Interaction During Walking. Ann Biomed Eng. 2020;48(2):722-733. doi:10.1007/s10439-019-02395-x