# Motion Planner for K-Legged Robots Trajectory Optimization

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### 1 Centroidal System Dynamics

$$m(\ddot{c}+g) = F_e + \sum_i F_i \tag{1}$$

$$mc \times (\ddot{c} + g) + \dot{L} = c \times F_e + \sum_i (S_i \times F_i)$$
 (2)

$$\dot{x} = g(x, u) \tag{3}$$

### 2 Variables

- c CoM x,y,z
- 1 Linear momentum x, y, z
- k Angular momentum x,y,z
- $F_{\lambda}$  Contact force of  $\lambda \log x, y, z$
- $S_{\lambda}$  Contact foot step position of  $\lambda \log x, y, z$
- $w_k, w_F, w_S$  Parameter weights for k,  $F_{\lambda}, S_{\lambda}$  in objective function.

### 3 Objective function and constraints

### 3.1 Objective Function

$$\min_{l,k} \frac{1}{2} \sum_{i=1}^{N} \left( ||l - l_d||^2 + w_k ||k - k_d||^2 + \sum_{\lambda=1}^{k \cdot legs} w_F ||F_\lambda||^2 + \sum_{\lambda=1}^{k \cdot legs} w_S ||S_\lambda - S_{d\lambda}||^2 \right)$$
(4)

### 3.2 Constraints

$$|F^x| \le \mu F^z$$

$$|F^y| \le \mu F^z$$

$$|F_{\lambda}^{x}| \leq \mu F_{\lambda}^{z} |F_{\lambda}^{y}| \leq \mu F_{\lambda}^{z} \quad \lambda \in \{1, \dots, k \rfloor egs\}$$

Equation label 1 - 4  $\lambda$ 

$$0 \le \mu F_{\lambda}^{z} - F_{\lambda}^{x}$$

$$0 \le \mu F_{\lambda}^{z} + F_{\lambda}^{x}$$

$$0 \le \mu F_{\lambda}^{z} - F_{\lambda}^{y}$$

$$0 \le \mu F_{\lambda}^{z} + F_{\lambda}^{y}$$

$$\lambda \in \{1, \dots, k\_legs\}$$

Equation label 5 x,y,z

$$l_{i+1} - \left(\sum_{\lambda=1}^{k \cdot legs} F_{\lambda i} + mg\right) \cdot \Delta t - l_i = 0$$

Equation label 6 x,y,z

$$k_{i+1} - \left(\sum_{\lambda=1}^{k.legs} (c_i - S_{\lambda i} \times F_{\lambda i})\right) \cdot \Delta t - k_i = 0$$

Equation label 7 x,y,z

$$c_{i+1} - c_i - \frac{1}{m}l_i \cdot \Delta t = 0$$

### 3.3 Jacobian gradient of objective function

$$J_{obj.} = \begin{bmatrix} \frac{\partial f_{obj}}{\partial c}, & \frac{\partial f_{obj}}{\partial l}, & \frac{\partial f_{obj}}{\partial k}, & \frac{\partial f_{obj}}{\partial F_0}, \dots, & \frac{\partial f_{obj}}{\partial F_i}, & \frac{\partial f_{obj}}{\partial S_0}, \dots, & \frac{\partial f_{obj}}{\partial S_i} \end{bmatrix}$$

### 3.4 Jacobian gradient of constraints

$$J_{g.} = \begin{bmatrix} \frac{\partial g}{\partial c}, & \frac{\partial g}{\partial l}, & \frac{\partial g}{\partial k}, & \frac{\partial g}{\partial F_0}, \dots, & \frac{\partial g}{\partial F_i}, & \frac{\partial g}{\partial S_0}, \dots, & \frac{\partial g}{\partial S_i} \end{bmatrix}$$

**Correct Assumption** Consider only foots with contact to the ground. Objective function and Constraint equations have to adapt for this assumption. Re-write them, where  $k \cdot legs \longrightarrow contact \cdot legs$  5. For this, we need to keep which legs has contact to the ground and consider only them.

$$\lambda \in \{1, \dots, k \rfloor legs\}$$

$$\min_{l,k} \frac{1}{2} \sum_{i=1}^{N} \left( ||l - l_d||^2 + w_k ||k - k_d||^2 + \underbrace{\sum_{\lambda=1}^{con \rfloor legs} w_F ||F_{\lambda}||^2}_{\text{legs in contact}} + \underbrace{\sum_{\lambda=1}^{con \rfloor legs} w_S ||S_{\lambda} - S_{d\lambda}||^2}_{\text{legs in contact}} \right)$$
(5)

**Important** The last affects the gradient of Objective function and the gradient of Constraints equation. Repetitively cyclic i leg parameter plays an important role in evaluation of functions (f), constraints (g) and much more in their gradient.

### 4 Future work

Add phases based on number of legs. Add phase for each i-leg in motion. Then, problem description will have k phases, that can be developed parametric consider the i leg to be in motion. Then, call this problem-phase repetitively for every  $i \in k$ . Now we have moved all the legs. Swing phases and k-supports needs also to be considered and developed as different phases. Get them in row, and you have described a centroidal k-legged motion planner totally correctly!

### 5 Results

**Ipopt** Info we take from ipopt when it tries to solve the problem with initial incorrect assumption.

Number of Iterations...: 4000

Number of objective function evaluations = 6809

Number of objective gradient evaluations = 6

Number of equality constraint evaluations = 6889

Number of inequality constraint evaluations = 6889

Number of equality constraint Jacobian evaluations = 4082

Number of inequality constraint Jacobian evaluations = 4082

Number of Lagrangian Hessian evaluations = 0

Total seconds in IPOPT = 121.177

EXIT: Maximum Number of Iterations Exceeded.

\*\*\* The problem FAILED!

**Plots** With initial assumption we get the following plots.

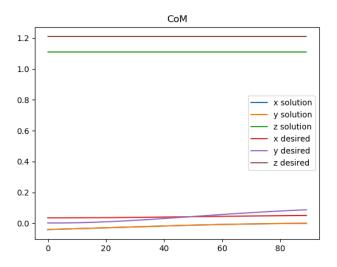


Figure 1: CoM solution

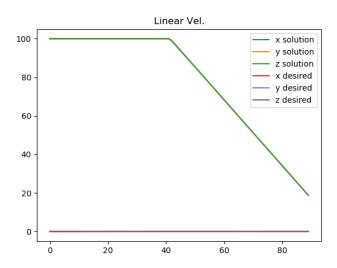


Figure 2: Linear momentum solution

## 6 Appendix

More figures to describe the problem.

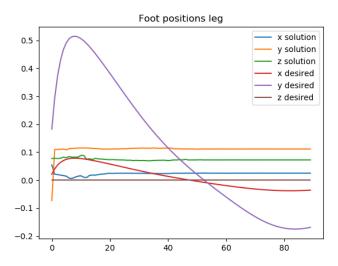


Figure 3: Foot position 0-leg solution

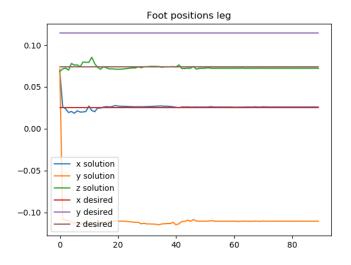


Figure 4: Foot position 1-leg solution

# Solution CoM 12 10 8 6 4 2 0 1 2 3 4 5 6 7 8 9 Points

Figure 5: Simplified dynamic solution

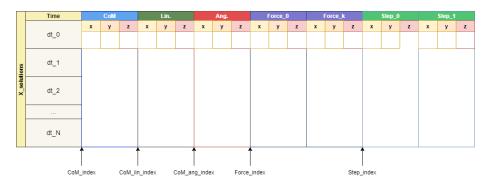


Figure 6: Solution variables mapping in ipopt of centroidal dynamic

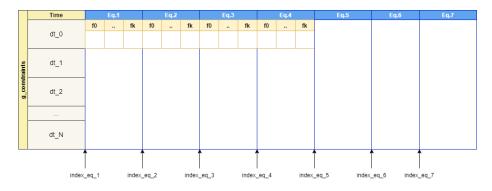


Figure 7: Constraints mapping in ipopt of centroidal dynamic

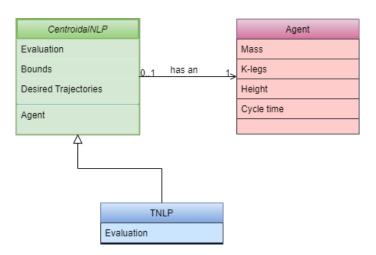


Figure 8: Class diagram