

# Quadratic program

$$\min_x \frac{1}{2} x^T Q x + C^T x \quad (+c^T c)$$

$x = \begin{cases} u - \text{control (torques)} \\ \ddot{q} - \text{configuration accelerations} \\ f - \text{contact forces} \end{cases}$

$$X = (\ddot{q}, \lambda, u)$$

$$\text{s.t. } \begin{cases} A_1 x = B_1 \\ A_2 x \leq B_2 \end{cases}$$

constraints:

- satisfy dynamics eqn of motion (1)
- non-sliding of contact points (2)
- contact forces inside (linearized) friction cone (6)
- actuator torques within limits (4)

← replace with  $\lambda$  (friction cone)

→ weighted tasks (soft constraints)

$Q$  has to be symmetric

Robot:  $q = (\underbrace{x_0}_{\text{base link}}, \underbrace{\theta_0}_{\text{joint angles vector}}, \hat{q})$

~~Why do we need?~~  
~~Doesn't it ensure this?~~

→ what makes sliding contacts hard?

Why QPs?

Any other convex form that can be solved just as reliably and quickly?

$$M(q)\ddot{q} + N(q, \dot{q})\dot{q} = M(q) \begin{pmatrix} g \\ 0_4 \\ u \end{pmatrix} + \sum_{k,i} J_{tk}(a_{k,i})^T f_{k,i} \quad (1)$$

$$\forall k,i \quad J_{tk}(a_{k,i})\dot{q} = 0$$

$k$ : index of each link in contact

$f_{k,i}$ : force at link  $k$

$K_{k,i}$ : friction cone  
Coulomb

$a_{k,i}$ : point of contact

$J_{tk}(p)$ :  $3 \times (3+4+j)$  translational Jacobian of link  $k$

$\mu$ : friction coefficient

linearize

$$\begin{cases} \forall k,i \quad f_{k,i} \in K_{k,i} \\ \forall j \quad u_{j,\min} \leq u_j \leq u_{j,\max} \end{cases} \quad (4)$$

vecs defining cone

$$f_{k,i} = \sum_{m=1}^{V_{k,i}} \lambda_{k,i,m} V_{k,i,m}$$

time differentiate

$$\forall k,i,m \quad \lambda_{k,i,m} \geq 0 \quad (6)$$

$$J_{tk}(a_{k,i})\ddot{q} + \dot{J}_{tk}(a_{k,i})\dot{q} = 0 \quad (7)$$

How much the end effector moves with small perturbations in  $\ddot{q}$  and  $\dot{q}$

(1), (4), (6), (7) as  $A_1 X = B_1, A_2 X \leq B_2$

$i$ :  
Abort entire stable contacts by placing lower limit on force

$$X = (\ddot{q}, \lambda, u)$$

$$L Y = \begin{pmatrix} Y_1 \\ \vdots \\ Y_n \end{pmatrix} \quad (\text{ex. } > 50N \text{ for } 70kg \text{ character})$$

$$Y = (Y_1, \dots, Y_n)$$

$$\alpha = \dim(\ddot{q}) = 3+4+r$$

$$\beta = \dim(\lambda) = \# \text{ contacts } \times \# \text{ of force vecs}$$

$$\gamma = \dim(u) = r \quad (4?)$$

$$z = ?$$

when would it not be 4?  
why does it have to be general (1)

$$A_1 = \begin{pmatrix} M(q) & -[J_{tk}(a_{k,i})^T V_{k,i,m}]_{k,i,m} & - \begin{pmatrix} 0_{3 \times r} \\ 0_{4 \times r} \\ 1_{r \times r} \end{pmatrix} \\ [J_{tk}(a_{k,i})]_{k,i} & 0_{3 \times \beta} & 0_{3 \times r} \end{pmatrix}$$

(3+4r) x  $\beta$

↑  
should this be  $L$ ?

$$B_1 = \begin{pmatrix} -N(q, \dot{q})\dot{q} + M(q) \begin{pmatrix} g \\ 0_4 \\ u \end{pmatrix} \\ -\dot{J}_{tk}(a_{k,i})\dot{q} \end{pmatrix}, \quad A_2 = \begin{pmatrix} 0_{\alpha \times \alpha} & -1_{\alpha \times \alpha} & 0_{\alpha \times r} \\ 0_{\gamma \times \alpha} & 0_{\gamma \times \beta} & -1_{\gamma \times \gamma} \\ 0_{\gamma \times \alpha} & 0_{\gamma \times \beta} & 1_{\gamma \times \gamma} \end{pmatrix}, \quad B_2 = \begin{pmatrix} 0_{\beta} \\ -u_{\min} \\ u_{\max} \end{pmatrix}$$

inequality constraint

$$A_2 X \leq B_2$$

$$\begin{matrix} \beta \\ \gamma \\ \gamma \end{matrix} \begin{bmatrix} 0_{p \times a} & -I_{p \times p} & 0_{p \times r} \\ 0_{r \times a} & 0_{r \times p} & -I_{r \times r} \\ 0_{r \times a} & 0_{r \times p} & I_{r \times r} \end{bmatrix} \begin{pmatrix} \ddot{q} \\ \lambda \\ u \end{pmatrix} \leq \begin{pmatrix} 0_p \\ -u_{min} \\ u_{max} \end{pmatrix}$$

$$\begin{pmatrix} \ddot{q} \\ \lambda \\ u \end{pmatrix} \begin{matrix} \alpha \\ \beta \\ \gamma \end{matrix}$$

Abe's contact point tricks!

- Threshold (conservative) for contact force magnitude
- Conservative estimate for contact region, strict interior of actual

~~Should A<sub>2</sub> be~~  
~~Is this wrong?~~  
~~A<sub>2</sub> = A<sub>2</sub><sup>T</sup> =~~  
~~proposed~~

$$0 \ddot{q} - I_{p \times p} \lambda_p + 0 u \leq 0_p \rightarrow \lambda_p \geq 0 \quad (4)$$

$$0 \ddot{q} + 0 \lambda - I_{r \times r} u \leq -u_{min} \rightarrow u \geq u_{min}$$

$$0_{r \times a} \ddot{q} + 0 \lambda + I_{r \times r} u \leq u_{max} \rightarrow u \leq u_{max} \quad (4)$$

• Equality constraint should handle (1) (7)

Figure out first:

(1) dynamics equation  
Jacobian

(7) non-sliding constraint

Assume  $q, \dot{q}$  static at each timestep

Dynamics linear in  $\ddot{q}$

Why do we need this? Doesn't friction cone constraint take care of this?

ie. if there is contact and

$$M(q) \ddot{q} - [J_{tk}(a_{ke})^T V_{k,i,m}]_{k,i,m} \lambda - \begin{pmatrix} 0 \\ 0 \end{pmatrix} u = -N(q, \dot{q}) \dot{q} + M(q) \begin{pmatrix} g \\ 0 \end{pmatrix}$$

$$[J_{tk}(a_{k,i})]_{k,i} \ddot{q} + 0 \lambda + 0 u = [-\dot{J}_{tk}(a_{k,i}) \dot{q}]_{k,i}$$

$$X = \begin{pmatrix} \ddot{q} \\ \lambda \\ u \end{pmatrix}$$

$$M(q) \ddot{q} + N(q, \dot{q}) \dot{q} = M(q) \begin{pmatrix} g \\ 0 \end{pmatrix} + \begin{pmatrix} 0 \\ 0 \\ u \end{pmatrix} + [J_{tk}(a_{ke})^T V_{k,i,m}]_{k,i,m} \lambda$$

Coriolis ~~terms~~      motor torques

$$J_{tk}(a_{k,i}) \ddot{q} + \dot{J}_{tk}(a_{k,i}) \dot{q} = 0$$

$$\begin{bmatrix} (3+4+r) \times 1 \\ \vdots \\ \vdots \end{bmatrix}$$

$$\begin{matrix} J \\ (3 \times (3+4+r))^T \\ \downarrow J^T \\ (3+4+r) \times 3 \end{matrix} \quad \begin{matrix} V \\ (3 \times 1) \\ \downarrow \\ (3+4+r) \times 1 \end{matrix} \quad \lambda \text{ is } 1$$

$$\begin{aligned} &= \sum_{k,i} J_{tk}(a_{k,i})^T f_{k,i} \\ &= \sum_{k,i} J_{tk}(a_{k,i})^T \sum_{m=1}^{\infty} \lambda_{k,i,m} V_{k,i,m} \end{aligned}$$

2D particle

$$\dot{g} = J_g \dot{q} \quad Q = [J_g^T J_g] \quad c = [J_g^T [k_s (g_{ref} - g) - k_v J_g \dot{q} - \ddot{g}_d \dot{q}]]$$

$$J_g = I$$

subtask objectives — tasks/features  
 $g: \mathbb{R}^{3+4+r} \rightarrow \mathbb{R}^d$  —  $\dim(\text{task})$

Should this be flipped?

$$\dot{g} = J_g \dot{q}$$

$J_g$  — Jacobian of task  $(3+4+r) \times d$   
 how small changes in feature affect  $q$ ?

Set point objective

$$E_{\text{set point, goal}}(X) = \frac{1}{2} \| K_p (g_{\text{ref}} - g) - K_v \dot{g} - \ddot{g} \|^2$$

$$= \frac{1}{2} X^T Q X + C^T X + \frac{1}{2} C^T C$$

$K_p, K_v$  hand tuned,  $K_v = 2\sqrt{K_p}$  heuristic

From Lasa

$$Q = \begin{pmatrix} J_g^T J_g & 0_{n \times B} & 0_{n \times r} \\ 0_{B \times n} & 0_{B \times B} & 0_{B \times r} \\ 0_{r \times n} & 0_{r \times B} & 0_{r \times r} \end{pmatrix}, C = \begin{pmatrix} -J_g^T (K_p (g_{\text{ref}} - g) - K_v J_g \dot{q} - \ddot{g}_g) \\ 0_p \\ 0_r \end{pmatrix}$$

Does  $\ddot{g}_{\text{des}}$  need to be PD controller?

loose math

$$X = \begin{pmatrix} \ddot{q} \\ \dot{q} \\ q \end{pmatrix}$$

minimize

$$\frac{1}{2} \ddot{q}^T J_g^T J_g \ddot{q} + (-J_g^T (K_p (g_{\text{ref}} - g) - K_v J_g \dot{q} - \ddot{g}_g)) \dot{q} + \frac{1}{2} (-J_g^T (K_p (g_{\text{ref}} - g) - K_v J_g \dot{q} - \ddot{g}_g))^T (-J_g^T (K_p (g_{\text{ref}} - g) - K_v J_g \dot{q} - \ddot{g}_g))$$

CoM task can be looser, to ~~the~~ just keep CoM inside support polygon?

Where does self-collision constraint come in?

Target objective uses constant-jerk reference trajectory

Target objective

$$\ddot{g}_{\text{ref}}(t) = \left(1 - \frac{t-t_0}{t_f-t_0}\right) \phi_{i,t_0} + \frac{t-t_0}{t_f-t_0} \psi_{i,t_0}, t \in [t_0, t_f]$$

Check this

Also where is stiffness?

$$\begin{bmatrix} T^2/3 & T^2/6 \\ T/2 & T/2 \end{bmatrix} \begin{bmatrix} a \\ b \end{bmatrix} = \begin{bmatrix} y_f - y_0 - \dot{y}_0 T \\ \dot{y}_f + \dot{y}_0 \end{bmatrix}$$

Round by integrating twice and writing boundary value conditions  
 solve with least-squares; pseudo-inverse where  $T = t_f - t_0$

$$\int_{t_0}^{t_f} \ddot{g}_{\text{ref}} dt = \int_{t_0}^{t_f} \left(1 - \frac{t-t_0}{t_f-t_0}\right) \phi_{i,t_0} dt + \int_{t_0}^{t_f} \frac{t-t_0}{t_f-t_0} \psi_{i,t_0} dt$$

$$\ddot{g}_f - \ddot{g}_0 = \int_{t_0}^{t_f} \left( \frac{(t-t_0)}{t_f-t_0} \phi_{i,t_0} dt + \dots \right)$$

First term dominates in beginning, then replaced gradually by second term  $\psi$ .

For large values  $T \gg 0$ , equivalent to cubic Hermite interpolation

Does Karim's formulation use minimum torque objective?

$$E_{\text{tst},g}(X) = \sum_{i=1}^d \frac{1}{2} (\ddot{g}_{\text{ref}}^i(t_0) - \ddot{g}^i)^2$$

$$= \sum_{i=1}^d \frac{1}{2} (\phi_{i,t_0} - \ddot{g}^i)^2$$

If damping is not defined, is it just based on stiffness w/ heuristic?

Prioritized optimization (Lasa, Mordati, Hertzmann)  
(Lexicographic? Strictly prioritized?)

$$h_i = \min_x E_i(x)$$

$$\text{s.t. } E_k(x) = h_k, \forall k \leq i$$

$$C(x) = 0$$

$$Dx + f \geq 0$$

$$h_1 = \min_x E_1(x)$$

$$\text{s.t. dynamics}$$

$$h_2 = \min_x E_2(x)$$

$$\text{s.t. dynamics}$$

$$+ h_1 = E_1(x)$$

Key idea:

Optimal solutions to a quadratic must lie on a linear subspace

$$E_k(x) = \|A_k x - b_k\|^2$$

$$A_k(x - x_k^*) = 0$$

optimum of previous iteration

$$A_k(x - x_k^*) = 0, \forall k \leq i$$

BUT this has difficulties with rapidly changing constraints  
Fails on active set methods

~~Reparametrization method~~ — more flexibility

$$E_1(x) = \|A_1 x - b_1\|^2$$

$$\dot{E}_1(x) = A_1 x - b_1 = 0$$

$$\frac{1}{2}(a^T x - b)^2$$

$$a^T x - b$$

Instead of equality constraints  $C(x) = 0$

infeasible solutions due to numerical issues

Add top-priority objective  $E(x) = \|C(x)\|^2$

minimized to zero

combine objectives at same priority level ~~with weights~~ with weights

Prioritized controllers allow control to be layered

Hierarchical control built into one optimization vs. hierarchy of simplified models

Disadvantages:

- Slower and more work to implement
- QP + SVD at each priority level
- Double precision arithmetic

$x(w) = C_1 w + d_1$

nullspace basis  
 $C_1 = \text{null}(A_1)$   
Find with SVD

any minimizer that satisfies dynamics constraints  
Find with QP

plug into  $E_2(x)$

$$E_2(w) = \|A_2 x(w) - b_2\|^2$$

$$= \|A_2 C_1 w + A_2 d_1 - b_2\|^2$$

plug into  $Dx + f \geq 0$

$$D C_1 w + D d_1 + f \geq 0$$

$$d_2 = \arg \min_w E_2(w)$$

$$\text{s.t. } D C_1 w + D d_1 + f \geq 0$$

$$x^* = C_1 d_2 + d_1$$

Repeat recursively

$$Q_{sum} = \sum_{k=1}^N W_k Q_k, \quad C_{sum} = \sum_{k=1}^N W_k C_k \rightarrow \min_X \frac{1}{2} X^T Q_{sum} X + C_{sum}^T X$$

$$s.t. A_1 X = B_1, A_2 X \leq B_2$$

- COM task is usually as setpoint objective, trying to keep the COM's horizontal position above the mid-point between two footprints.

Can we generalize this to other situations?

ex.



Place COM desired pos near midpoint of horizontal projection of all contact points.

This is a simple strategy, doesn't prevent falling on its own. Need force in combination with standing posture task.

Recovery strategy when QP fails?

Contact change event

$$\eta = (e, s, t, \sigma) \in E \times S \times \mathbb{R} \times \{0, 1\}$$

link index / timing  
environment surface  
type 0: leaving contact  
1: entering contact

For short time after entering contact, do contact stabilization w/ QP (pause human tracking, new QP)

$$\begin{aligned} \sigma = 0 & \quad E_i \leftarrow E_i \setminus \{e_i\} & \sigma = 1 & \quad E_i \leftarrow E_i \cup \{e_i\} \\ E_2 \leftarrow E_2 \cup \{e_i\} & & E_2 \leftarrow E_2 \setminus \{e_i\} & \end{aligned}$$

Track human marker while keeping contact tangential (surface) velocity zero, get contact orientation task to 1

Motion retargeting paper

$$\min_{\ddot{q}, u, f_c} \sum_{k=1}^m W_k \|\ddot{q}_k - \ddot{q}_k^d\|^2 \quad (1)$$

$$s.t. M\ddot{q} + N = Su + J_c^T \Lambda_c f_c \quad (2)$$

$$J_c \dot{q} + J_c \ddot{q} = 0 \quad (3)$$

$$f_c \geq 0 \rightarrow f_c = \sum \lambda_i v_i \quad (4)$$

$$\lambda_i \geq 0$$

$$u_{min} \leq u \leq u_{max} \quad (5)$$

$$\frac{q_{min} - q}{\Delta t} \leq \ddot{q} \leq \frac{q_{max} - q}{\Delta t} \quad (6)$$

Joint limit constraint

$$\ddot{d}(b_1, b_2) \geq \frac{1}{\Delta t} \left( -\gamma \frac{d(b_1, b_2) - \delta_s}{\delta_i - \delta_s} - \dot{d}(b_1, b_2) \right) \quad (8)$$

$$\frac{q_{min} - q}{\Delta t} \leq \ddot{q} \leq \frac{q_{max} - q}{\Delta t} \quad (7) \text{ constraint}$$

Joint velocity limit

Dropped during initialization of posture, along w/  $f_c$  and  $u$  from decision variables

Only Link position tasks + half-sitting posture task

Look for details of this in ladder climbing paper

(8) collision avoidance

constraint b/w  $b_1$  and  $b_2$  of robot & env X pairs of possible collisions

$\gamma$ : damping coefficient

$\delta_s$ : security distance

$\delta_i$ : influence distance

What does this actually mean?

Just flat contact?

Maintain two sets  $E_1, E_2$

links in contact

Remove these links

position and orientation tasks, since constraint 3 deals with that

Objective: tracking tasks (markers) + COM (balance) + posture

center of convex hull of ground projection of surfaces in  $E_1$

# Multi robot

Why don't they acknowledge approaches of other DRC teams? or more detail

What does a selection matrix look like?

Forces  $F_i$ :  $f_i^0, f_i^-, f_i^+$

forces applied by robot  $i$  on robots  $j > i$   
fixed env on robot forces applied by robots  $j < i$  on robot  $i$

stack of vectors  
 $\begin{bmatrix} F^0 \\ F^- \\ F^+ \end{bmatrix}$

$F^- \in \mathbb{R}^{3k}$  —  $k$ : # of forces

Newton's third law

$$F^+ = (\Pi \otimes I_3) F^-$$

$\Pi \in \mathbb{R}^{k \times k}$  — Kronecker product  
 $\Psi = \Pi \otimes I_3$

$$\begin{bmatrix} \Pi_{11} I_3 & \dots & \Pi_{1k} I_3 \\ \vdots & \ddots & \vdots \\ \Pi_{k1} I_3 & \dots & \Pi_{kk} I_3 \end{bmatrix}$$

1. rest  $\rightarrow$  remain at rest

2.  $F = ma$

3. ~~force~~ equal and opposite

Decomposed into selection matrix blocks  $\Psi_i \in \mathbb{R}^{3k_i \times 3k}$

$$\Psi = \begin{pmatrix} \Psi_1 \\ \vdots \\ \Psi_n \end{pmatrix} \text{ — for each } i, f_i^+ = \Psi_i F^-$$

Dynamics:

$$M_i(q_i) \ddot{q}_i + N_i(q_i, \dot{q}_i) = J_{i,0}^T f_i^0 + J_{i,-}^T f_i^- - J_{i,+}^T \Psi_i F^- + S_i \tau_i$$

~~this should be~~  
 ~~$f^-$~~

Typo in multi-contact... pg 3  
pg 6 "monographs"

$$M(q) \ddot{q} + N(q, \dot{q}) = J_0^T F^0 + (J_- - \Psi^T J_+)^T F^- + S \tau$$

coincidence of contact points:  $(J_- - \Psi^T J_+) \dot{q} = 0$   
 $J_0 \dot{q} = 0$

Lagrange multiplier?

To deal with model error and contact state mismatch, they use force controller.

Admittance controller (on any link equipped w/ F/T sensor)

QP end-effector task

$$V = K_x (f_{\text{target}} - f_{\text{sensor}} / n)$$

clamp  $(V_{\min}, V_{\max}) = [-0.05, 0.5]$

This lets manipulator "search" for a surface it is supposed to be in contact with

gain  $K_x = 5 \times 10^{-4}$  force along normal of surface  $\tilde{V}$

Low-pass filtered  $\rightarrow$  QP task  $(\ddot{g}^{\text{ref}}, \dot{g}^{\text{ref}}, \ddot{g}^{\text{ref}})$

Is "QP force task" same as end-effector task?

Derivation of setpoint task

$g = f(q)$  generalized state

$$\dot{g} = J \dot{q}$$

product rule

$$\ddot{g} = J \ddot{q} + \dot{J} \dot{q}$$

$$\ddot{g}^{\text{des}} = k_p (g^{\text{des}} - g_{\text{cur}}) - k_d \dot{g}_{\text{cur}}$$

$$\|\ddot{g}^{\text{des}} - \ddot{g}\|^2$$

substituting

$$\|k_p (g^{\text{des}} - g) - k_d \dot{g} - J \ddot{q} - \dot{J} \dot{q}\|^2$$

Our decision variable is  $\ddot{q}$  Rearranging...

$$\| -J \ddot{q} + [k_p (g^{\text{des}} - g) - k_d \dot{g} - \dot{J} \dot{q}] \|^2$$

$$\text{recall: } \|Ax - b\|_2^2 = x^T (A^T A) x - 2(A^T b)^T x + b^T b$$

$$A = -J \quad b = k_p (g^{\text{des}} - g) - k_d \dot{g} - \dot{J} \dot{q}$$

$$x = \ddot{q}$$

$$\ddot{q}^T (J^T J) \ddot{q} + 2(J^T b)^T \ddot{q} + b^T b$$

Ignore constants and stuff that doesn't depend on  $\ddot{q}$

Wieber 2005

q - configuration vector

$\dot{q}, \ddot{q}$

$$\dot{x}_k = J_{tk}(q) \dot{q}$$

$$\ddot{x}_k = J_{tk}(q) \ddot{q} + \dot{J}_{tk}(q, \dot{q}) \dot{q}$$

$$w_k = J_{rk}(q) \dot{q}$$

$$\ddot{w}_k = J_{rk}(q) \ddot{q} + \dot{J}_{rk}(q, \dot{q}) \dot{q}$$

virtual work  $\rightarrow$  Gauss's principle

~~of, per, with~~

"Acc of set of solids s.t. some constraints deviates the least possible from acc that it would have had without the constraints"

$$D = \sum_k \frac{1}{2} (\ddot{x}_k - \ddot{x}_k)^T m_k (\ddot{x}_k - \ddot{x}_k) + \frac{1}{2} (\ddot{w}_k - \ddot{w}_k)^T I_k (\ddot{w}_k - \ddot{w}_k)$$

To minimize D, do some math  $\rightarrow$  joints on robot

$$\frac{\partial D}{\partial \ddot{q}} = M(q) \ddot{q} + N(q, \dot{q}) \dot{q} - F = 0$$

Newton-Euler eqns

$$m_k \ddot{x}_k = f_k$$

$$I_k \ddot{w}_k - (I_k w_k) \times w_k = \tau_k$$

gyroscopic term, b.c. Euler eqn defined ~~in~~ in frame attached to the solid

inertia matrix  $M(q) = \sum_k J_{tk}^T m_k J_{tk} + J_{rk}^T I_k J_{rk}$

nonlinear dynamics  $N(q, \dot{q}) = \sum_k J_{tk}^T m_k \dot{J}_{tk} + J_{rk}^T I_k \dot{J}_{rk} - J_{rk}^T (I_k J_{rk} \dot{q}) \times J_{rk}$

forces  $F = \sum_k J_{tk}^T f_k + J_{rk}^T \tau_k$

skew symmetric matrix

Note: different order from "Using a multi-objective..." by Karim

$$\begin{bmatrix} 0 & -v_3 & v_2 \\ v_3 & 0 & -v_1 \\ -v_2 & v_1 & 0 \end{bmatrix}$$

$$q = \begin{bmatrix} q \\ x_0 \\ \theta_0 \end{bmatrix}$$

$$\dot{x}_k = R_0 \hat{J}_{tk} \dot{q} + \dot{x}_0 - (x_k - x_0) \times R_0 J_{R_0} \dot{\theta}_0$$

$$w_k = \hat{J}_{rk} \dot{q} + R_k^T R_0 J_{R_0} \dot{\theta}_0$$

$$J_{tk} = [R_0 \hat{J}_{tk} \quad I_{3 \times 3} \quad -(x_k - x_0) \times R_0 J_{R_0}]$$

$$J_{rk} = [\hat{J}_{rk} \quad O_{3 \times 3} \quad R_k^T R_0 J_{R_0}]$$

Jacobian: How much does output change in  $y = f(x)$  if  $x_i$  changes by a little? increases

Linear approximation of f at  $x_0$

$$J = \left[ \frac{\partial f}{\partial x_1} \dots \frac{\partial f}{\partial x_n} \right]$$

$$= \begin{bmatrix} \frac{\partial f_1}{\partial x_1} & \dots & \frac{\partial f_1}{\partial x_n} \\ \vdots & \ddots & \vdots \\ \frac{\partial f_m}{\partial x_1} & \dots & \frac{\partial f_m}{\partial x_n} \end{bmatrix}$$