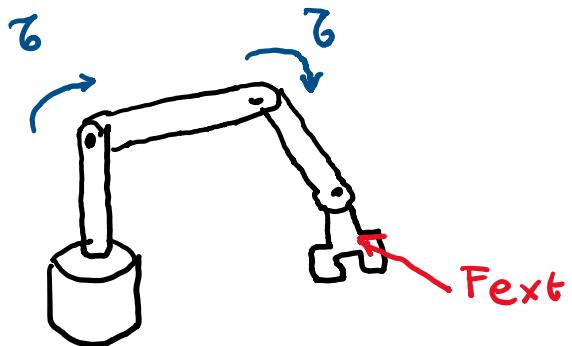


F1-Robot Dynamics

Newton-Euler Approach

DYNAMIC MODEL OF ROBOTS

Dynamic model: provides a description of the relationship between the sources of motion (forces/momenta/internal/external) and the resulting motion



Problem: forces applied in different point of the robot need to be transformed into equivalent ones that will make work on the generalized coordinates q

$$\dot{\Phi}(q, \dot{q}, \ddot{q}) = u \rightarrow \text{generalized forces associated to generalized coordinates } q$$

$$u(t) \rightarrow \boxed{\Phi} \rightarrow q, \dot{q}, \ddot{q}$$

2^o order differential equation

(robot is a set of rigid bodies \rightarrow masses)

DIRECT DYNAMICS

The term direct/inverse depends on which variable we consider as input

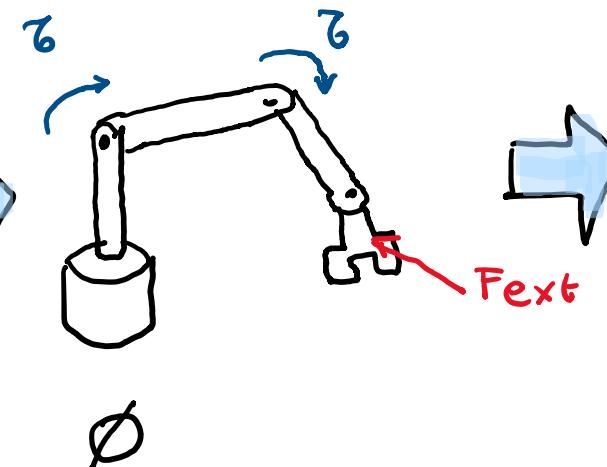
$$u(t) = \begin{bmatrix} z_1 \\ \vdots \\ z_N \end{bmatrix}$$

input for $t \in [0, T]$



$$q(0), \dot{q}(0)$$

initial state at $t = 0$



$$q(t) = \begin{bmatrix} q_1 \\ \vdots \\ q_N \end{bmatrix} \text{ at } t$$

Resulting motion

for a 2nd order system
the state is x, \dot{x}

Numerical

Solution: by simulation = integrate numerically (RK / Euler integration methods) The diff. equations

$\dot{\phi} = u$ of the model (non linear \Rightarrow no closed form solution)

THUMB RULE : set simulation step $T_s \leq \frac{1}{10} T_c$

PURPOSE OF DIRECT DYNAMICS : predict robot behaviour for

- controller design
- mechanical design

INVERSE DYNAMICS

$$q^d(t), \dot{q}^d(t), \ddot{q}^d(t)$$

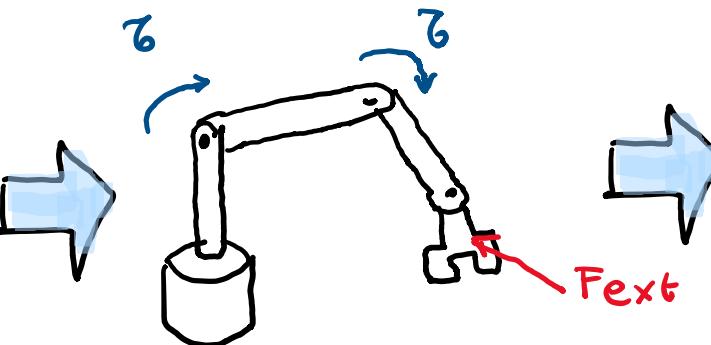


INPUT: desired motion for $t \in [0, T]$

Traj. should be defined up to acceleration because our diff. equation is 2^o Order

Experimental: repeated Trials with iterative learning solution
(no previous knowledge of the robot)

Analytic: use dynamic model (identified) to compute solution algebraically $u^d(t)$ at every Time instant t
↳ instantaneous evaluation - no integration



$$u^d(t) = \begin{bmatrix} \zeta_1^d \\ \vdots \\ \zeta_N^d \end{bmatrix}$$

for $t \in [0, T]$

Torques needed to realize the motion

unique if
 $\dim q = \dim u$

underconstrained
if $\dim q > \dim u$
(we don't cover this)

PURPOSE OF INVERSE DYNAMICS

- model-based control
- actuator sizing

APPROACHES TO DYNAMIC MODELING

There are 2 methods to derive the dynamic model of a manipulator:

(A) Lagrangian approach

(B) Newton - Euler

Euler - Lagrange

- energy-based
- \oplus analysis of dynamic properties (mass, com etc.)
- \oplus analysis of control schemes
- symbolic closed form
- \ominus explodes for many DoFs

Newton - Euler

- balance of forces / moments extended to multi bodies
- \oplus efficient recursive implementation
- \oplus best for implementing in real time ($O(N)$, $N = \# \text{DoFs}$)
- dynamic equations in numeric form

NEWTON-EULER METHOD

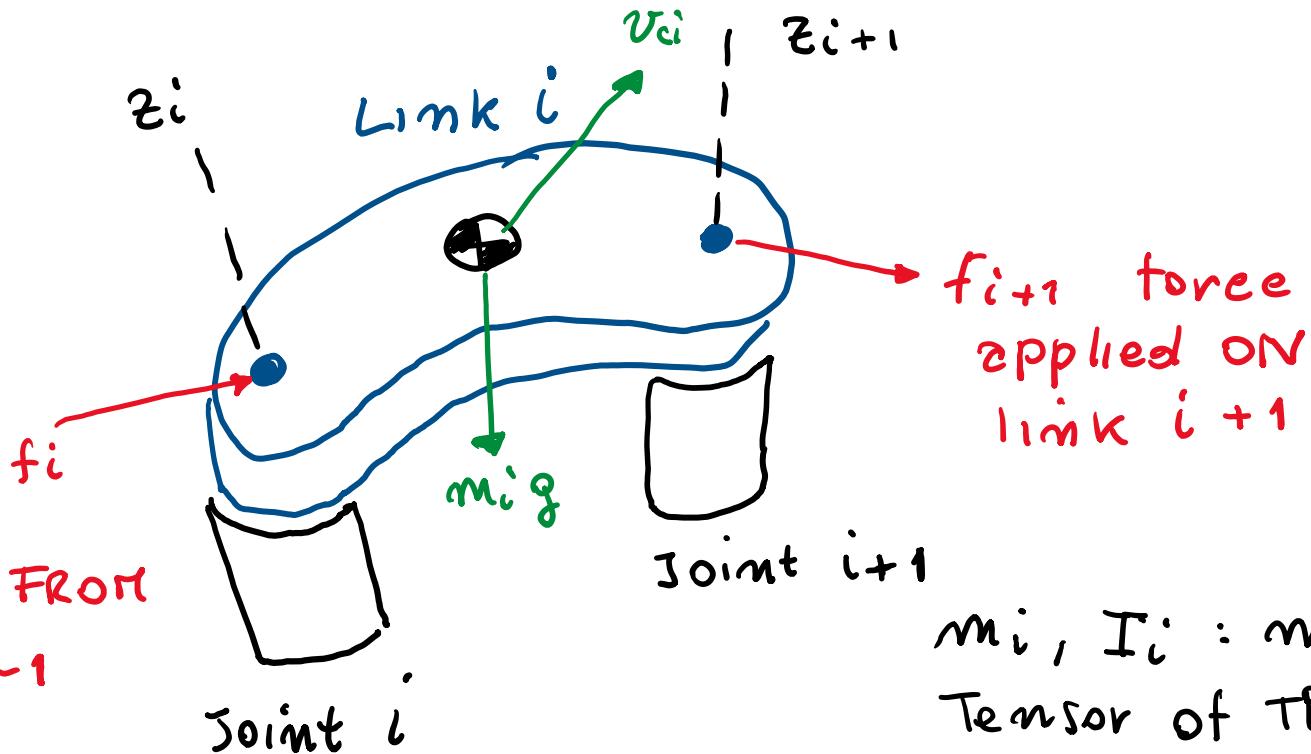
- based on classical mechanics equations
- based on balance of forces / moments on a single link , considering interactions from nearby links in the kinematic chain
- same model output as lagrangian

NEWTON EQUATION

$$\sum f_i = \frac{d}{dt} (m v_{ci}) = m \dot{v}_{ci} = m \ddot{r}_{ci}$$

vectors are expressed
in world frame

↳ variation of linear momentum

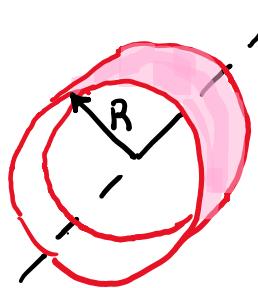


m_i, I_i : mass / inertia
Tensor of the link
w.r.t. COM

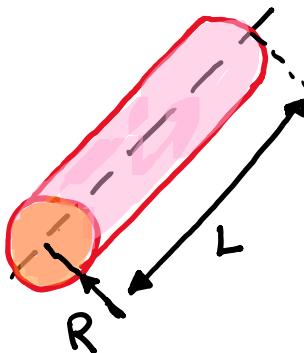
$$(1) f_i - f_{i+1} + m_i g = m_i \ddot{r}_{ci} \rightarrow \text{linear acceleration of COM of link } i$$

EXAMPLES OF MOMENTS OF INERTIA

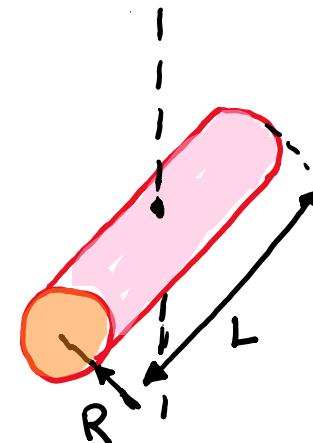
moment of inertia: rotational inertia about a single axis



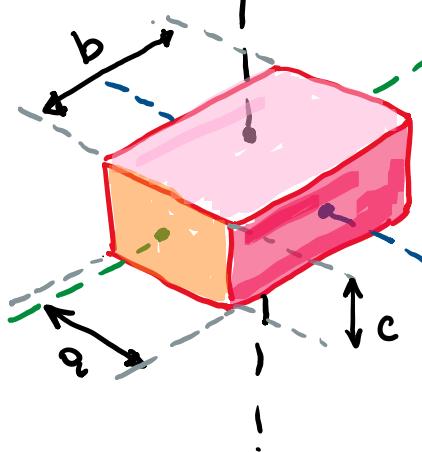
$$J = MR^2$$



$$J = \frac{1}{2} MR^2$$



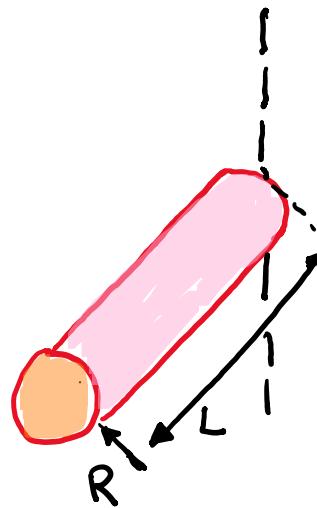
$$J = \frac{1}{2} ML^2$$



$$J = \frac{1}{12} M(a^2 + b^2)$$

$$J = \frac{1}{12} M(c^2 + b^2)$$

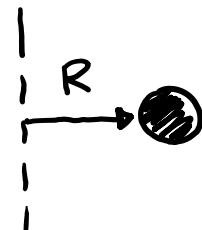
$$J = \frac{1}{12} M(a^2 + c^2)$$



$$J = \frac{1}{3} ML^2$$

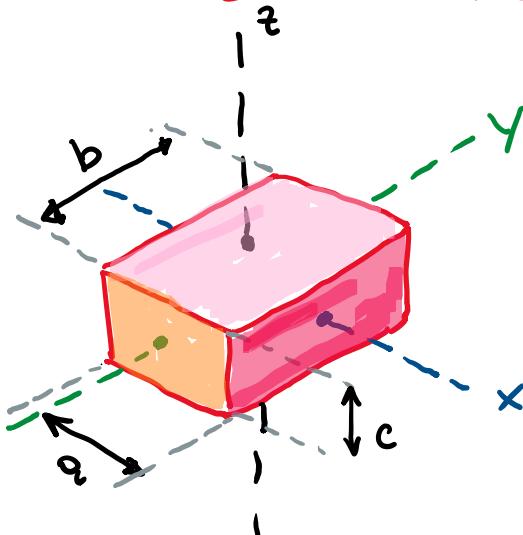
point mass

$$J = MR^2$$



\Rightarrow inertia is higher if mass is distributed far from the rotational axis

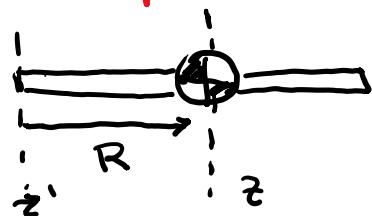
EXAMPLE OF TENSOR OF INERTIA



$$I = \begin{bmatrix} J_{xx} & 0 & 0 \\ 0 & J_{yy} & 0 \\ 0 & 0 & J_{zz} \end{bmatrix}$$

$$= \begin{bmatrix} \frac{1}{12}m(c^2 + b^2) & 0 & 0 \\ 0 & \frac{1}{12}m(c^2 + a^2) & 0 \\ 0 & 0 & \frac{1}{12}m(a^2 + b^2) \end{bmatrix}$$

Assumption: The frames should be parallel



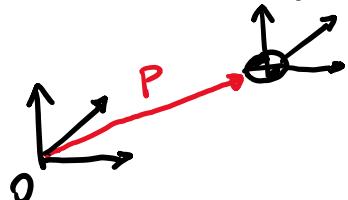
parallel axis
theorem

for the 1D case:

$$J_{z'} = J_z + mR^2$$

HUYGENS-STEINER'S THEOREM

computes The Tensor of inertia about another frame given I_{COM} (e.g. expressed in z frame with origin in COM)



$$I_o = I_{COM} + m(P^T P I_{3 \times 3} - P P^T)$$

\hookrightarrow identity

EULER EQUATION

equation for rotational motion:

- ① we choose as pole the COM
- ② we express the vectors in world frame
angular momentum

$$\sum m_i = \frac{d}{dt} (I_{\text{com}} \dot{\omega}) = I_{\text{com}} w \ddot{\omega} + \frac{d}{dt} (w R_i i \underbrace{I_{\text{com}} w R_i^T}_{\substack{\text{constant in} \\ \text{link frame}}} \dot{\omega})$$

$$= I_{\text{com}} \ddot{\omega} + (\dot{R}_i I_{\text{com}} R^T + R_i \dot{I}_{\text{com}} R^T) \omega$$

$$= I_{\text{com}} \ddot{\omega} + \underbrace{[\omega]_x R_i I_{\text{com}} R^T \omega}_{I_{\text{com}}} + R_i \dot{I}_{\text{com}} R^T [\omega]_x^T \omega = -[\omega]_x \omega$$

$\sum m_i = I_{\text{com}} \ddot{\omega} + \omega \times I_{\text{com}} \omega$

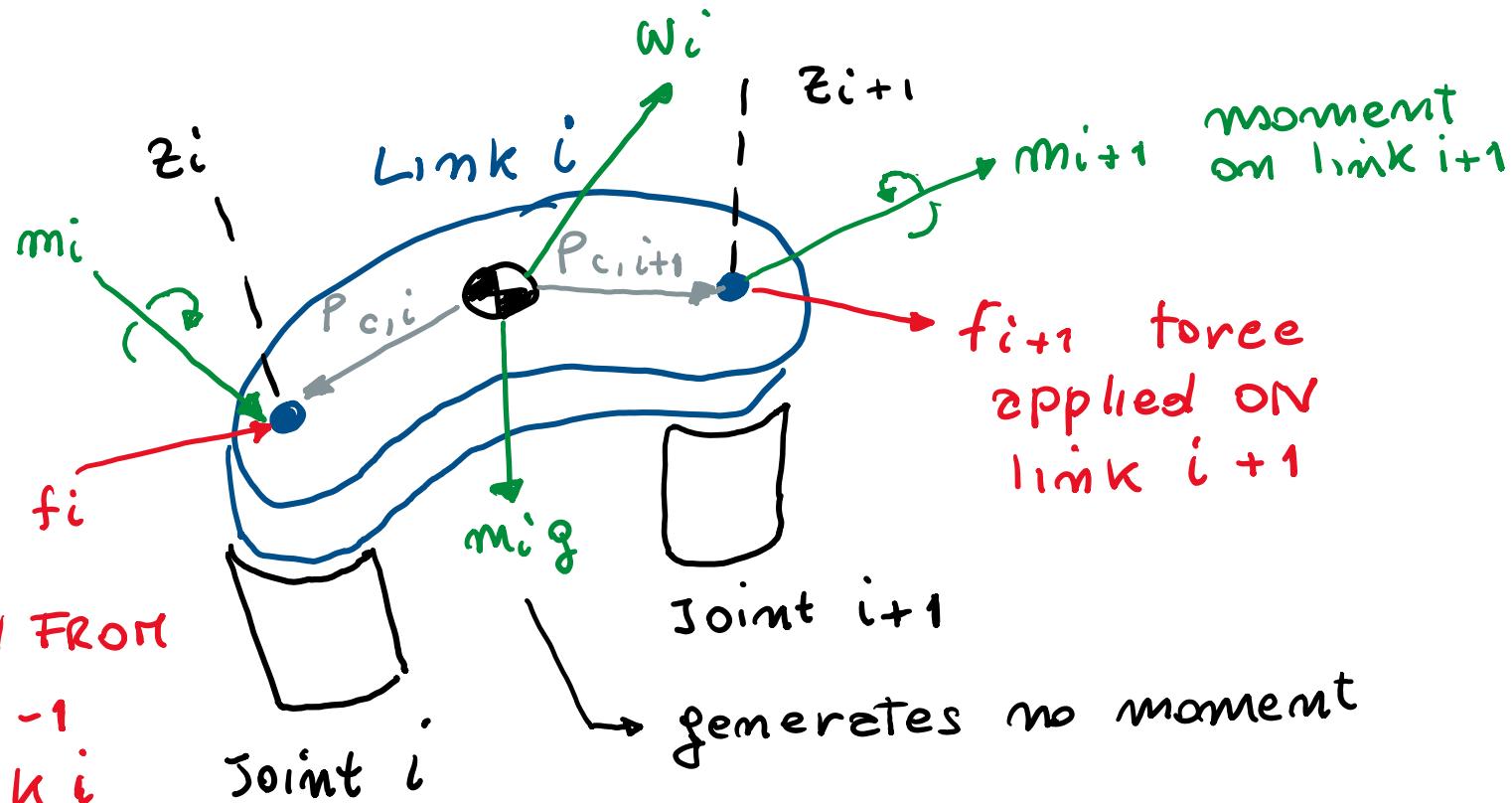
\downarrow
 $\omega \times \omega = \emptyset$
 parallel

I_{com} \Rightarrow inertia of link i wrt its COM
 expressed in frame W

EULER EQUATION

moment from link $i-1$ on link i

force applied FROM link $i-1$ ON link i



$$(2) m_i - m_{i+1} + P_{c,i} \times f_i + P_{c,i+1} \times (-f_{i+1}) =$$

$$I_i \ddot{w}_i + w_i \times (I_i w_i)$$

↑ angular acceleration of body

RECUSION IDEA

- (A) **Forward pass:** propagate velocities and accelerations from base to end-effector through forward kinematics
- (B) **BACKWARD PASS:** compute forces/moments for each link going from end-effector to base using (1), (2)
This will provide f_i, m_i . That should be projected along the axis of the supporting joint.

ACCELERATION RECUSION (AR) (REVOLUTE)

- $\omega_i = \omega_{i-1} + \dot{\varphi}_i z_i$

$$\overleftarrow{\omega_0}$$

$$\overleftarrow{\dot{\omega}_0}$$

- $\dot{\omega}_i = \dot{\omega}_{i-1} + \ddot{\varphi}_i z_i + \dot{\varphi}_i \omega_{i-1} \times z_i$

$$\overleftarrow{v_0}$$

- $v_i = v_{i-1} + \omega_{i-1} \times p_{i-1,i}$

$$\overleftarrow{a_0 - g}$$

- $\ddot{z}_i = \ddot{\varphi}_{i-1} + \ddot{\omega}_{i-1} \times p_{i-1,i} + \omega_{i-1} \times (\omega_{i-1} \times p_{i-1,i})$

- get \ddot{z}_i from \ddot{a}_i same way

BACKWARD RECURSION (FTR)

$$f_i = f_{i+1} + m_i \quad (\cancel{Q_{ci} - i\bar{g}})$$

$$\begin{aligned} m_i &= m_{i+1} - p_{c,i} \times f_i + p_{c,i+1} \times f_{i+1} \\ &\quad + I_i \dot{w}_i + w_i \times I_i \dot{w}_i \end{aligned}$$

$$z_i = \begin{cases} z_i^T f_i & \text{for prismatic joints} \\ z_i^T m_i & \text{for revolute joints} \end{cases} \Rightarrow \text{is a scalar!}$$

\Rightarrow The remaining components of f_i, m_i are **internal forces** transmitted through the joint from one link to the other

- recursion makes Newton-Euler algorithm computationally efficient

ALGORITHM

→ gravity acceleration

INPUT: Base link: $\omega_0, \ddot{p}_0 - g_0, \dot{\omega}_0$

\oplus

Joints: q, \dot{q}, \ddot{q}

\oplus

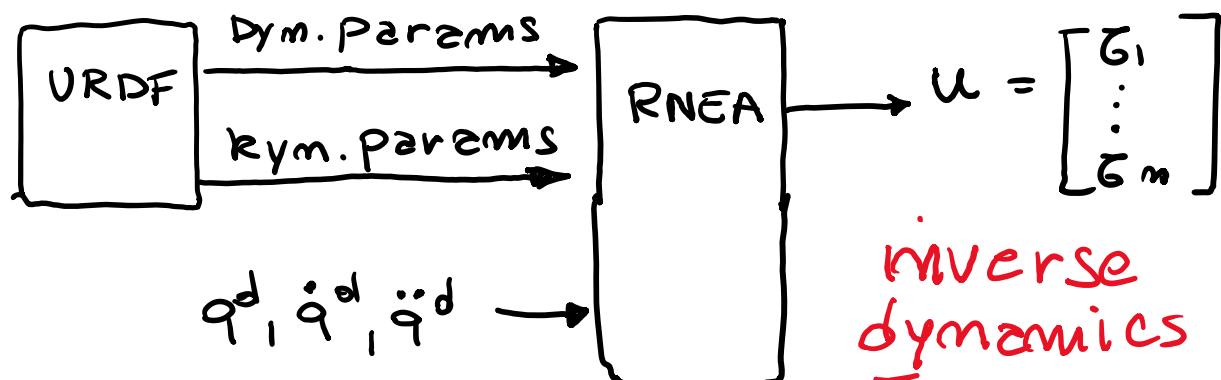
Last link: f_{n+1}, m_{n+1} (Terminal condition)

1

FWD RECURSION: computation $w_i, \dot{w}_i, \ddot{w}_i, p_{ci}, \ddot{p}_{ci}$

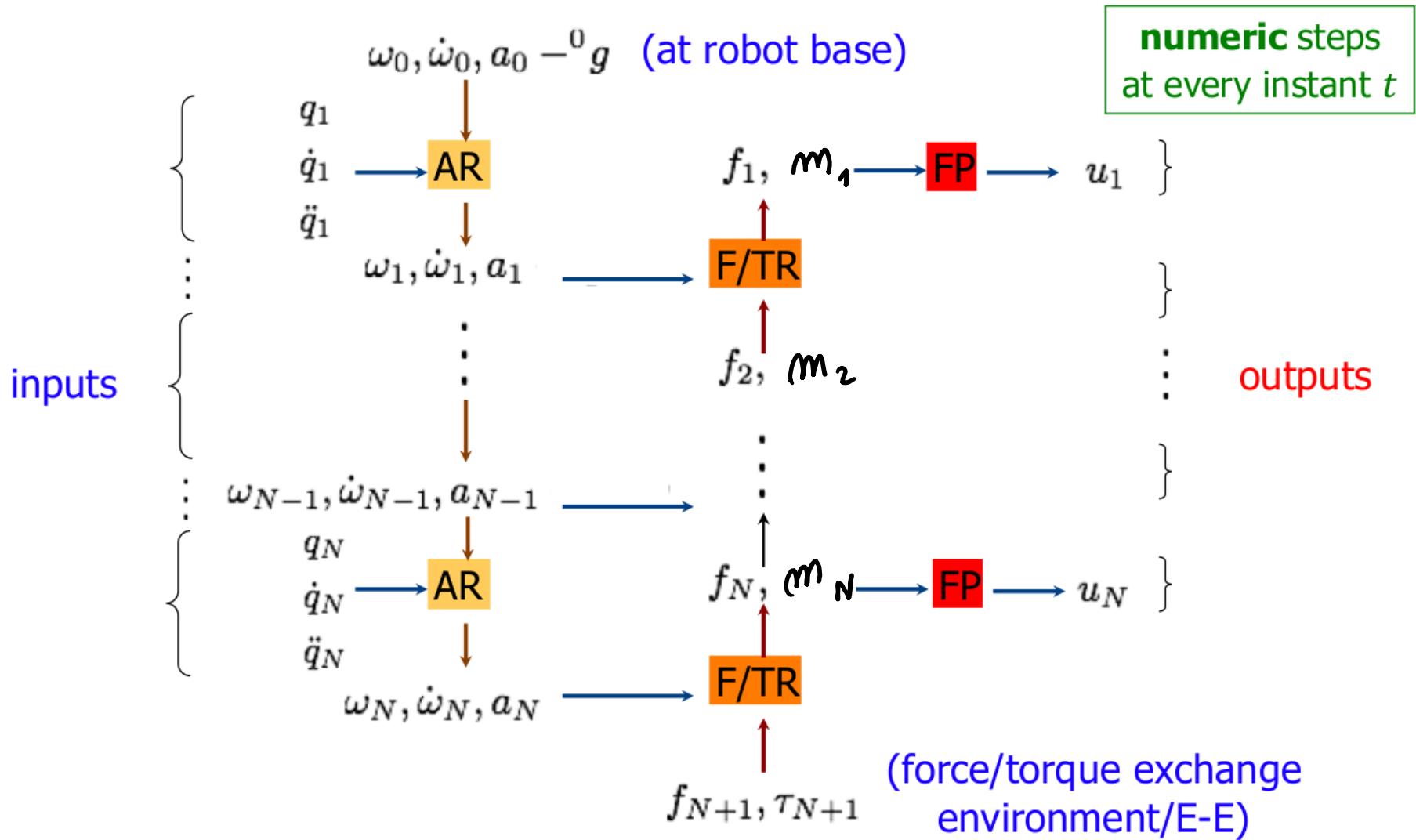
BWD RECURSION: computation f_i, m_i

OUTPUT: T_i



Inverse
dynamics
Torques

Recursive Newton-Euler algorithm



COMMENTS

- advantage of RNEA (recursive Newton-Euler algorithm) is in numeric form not in symbolic.
- computational complexity of each step remains constant \Rightarrow algorithm complexity $O(m)$ while Lagrange approach explodes for $m > 3$
- strongly recommended for real time especially when $n \uparrow$
- works for any kind of robot, given the kinematic / dynamic model (from CAD)

Joint
space
dynamic
model

$$(1) \quad M(q) \ddot{q} + c(q, \dot{q}) + g(q) = u$$

- The models we found are of the form $\ddot{\phi}(q, \dot{q}, \ddot{q}) = u$ and the dynamic equations are valid for any type of robot
- it can be shown that each element of vector $c(q, \dot{q})$ can be computed with:

$$c_k(q, \dot{q}) = \dot{q}^T C_k(q) \dot{q} \quad \xrightarrow{\text{k-th column of } M}$$

$$\text{where } C_k(q) = \frac{1}{2} \left[\frac{dM_k}{dq} + \left(\frac{dM_k}{dq} \right)^T - \frac{dM}{dq_k} \right]$$

\hookrightarrow Christoffel symbol

- Alternatively is possible the derivation in the scalar version (De Luca - Robotics 2 - lecture 8):

$$k=1, \dots, n$$

$$\sum_{j=1}^m m_{kj}(q) \ddot{q}_j$$

inertial
Terms
(multibody
version of
 $F = ma$)

Linear in \ddot{q}

$$+ \sum_{i,j}^m c_{kij}(q) \dot{q}_i \dot{q}_j$$

centrifugal ($i=j$)

\dot{q}_i^2 quadratic Terms

Coriolis ($i \neq j$)

$\dot{q}_i \dot{q}_j$ mixed Terms

quadratic in \dot{q}

$$\frac{\partial U}{\partial q_k} = u_k$$

gravity Terms
 $g_k(q)$

non linear
in q

$k=1, \dots, n$

$$\sum_{j=1}^m m_{kj}(q) \ddot{q}_j + \sum_{i,j}^m c_{kij}(q) \dot{q}_i \dot{q}_j + \frac{\partial U}{\partial q_k} = u_k$$

- $m_{kk}(q)$: inertie "seen" at joint k when joint k accelerates
- $m_{kj}(q)$: inertie "seen" at joint k when joint j accelerates (coupling)
- $c_{kii}(q)$: centrifugal force felt at joint k when joint i is moving
- $c_{kij}(q)$: Coriolis force felt at joint k when $\dot{q}_i \neq 0, \dot{q}_j \neq 0$

POSSIBLE USES OF RNEA

- compute inverse dynamics (at each loop)

$$u = \text{RNEA}(g, q, \dot{q}, \ddot{q}^d) = M(q)\ddot{q}^d + c(q, \dot{q}) + g(q)$$

↳ vector of numbers

- gravity terms:

$$u = \text{RNEA}(g, q, 0, 0) = \cancel{M(q)\ddot{q}^d} + \cancel{c(\cdot)} + g(q)$$

\downarrow no inertial / centrifugal

- centrifugal / coriolis

$$u = \text{RNEA}(0, q, \dot{q}, 0) = c(q, \dot{q}) \rightarrow \begin{matrix} \text{cannot} \\ \text{compute} \\ \text{e} \\ \text{factorization} \end{matrix} S$$

- i-th column of the inertia matrix

$$u = \text{RNEA}(0, q, 0, e_i) = M_i(q) \quad \xrightarrow{\hspace{10em}} \begin{bmatrix} 0 \\ 1 \\ \vdots \\ 0 \end{bmatrix}$$

- generalized momentum:

$$u = \text{RNEA}(0, q, 0, \dot{q}) = M(q)\dot{q}$$

Inverse dynamics of a 2R planar robot

$$m_1 = 10 \text{ kg}$$

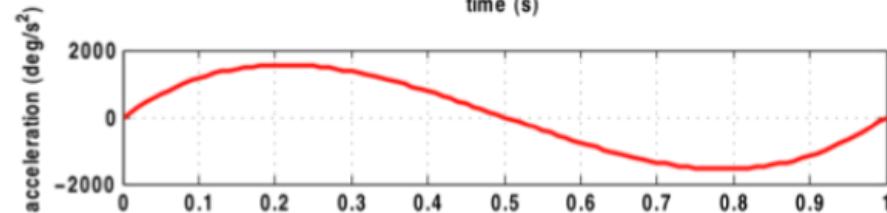
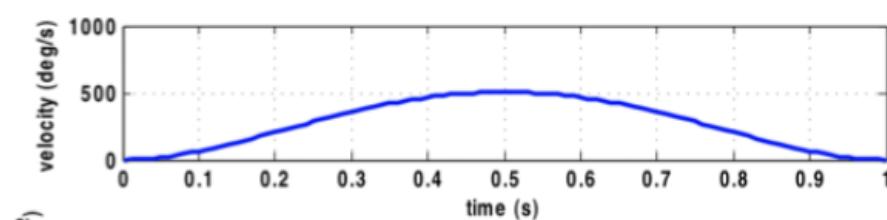
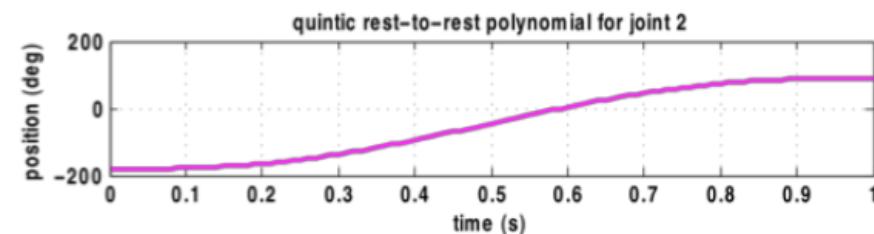
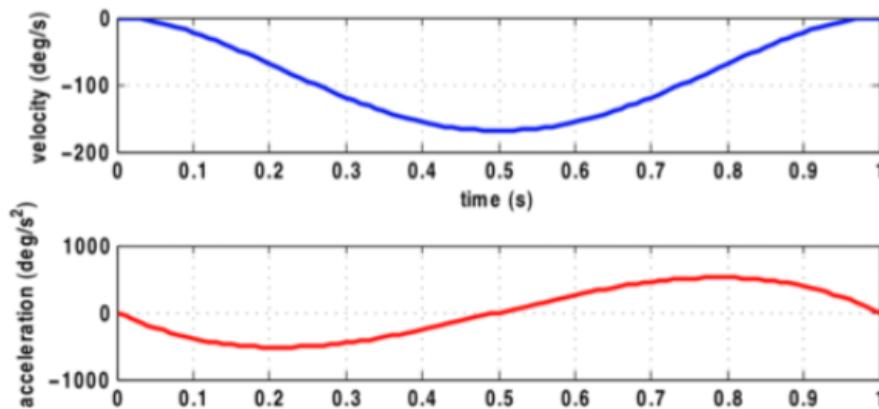
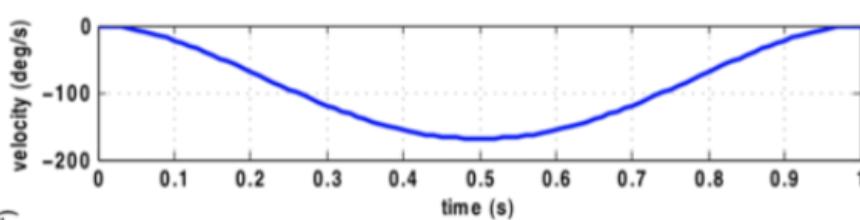
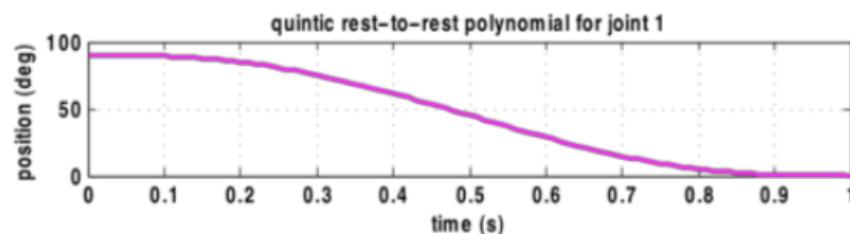
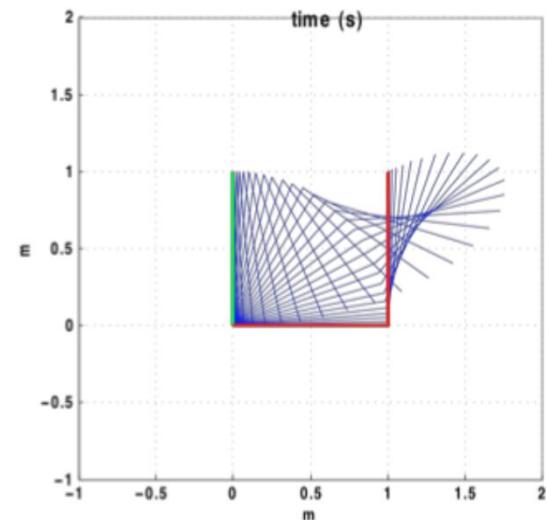
$$m_2 = 5 \text{ kg}$$

$$q_1 : 90^\circ \rightarrow 0^\circ$$

$$q_2 : -180^\circ \rightarrow 90^\circ$$

quintic polynomials: set $\ddot{q} = 0$ at start/end

gravity ON (vertical plane)



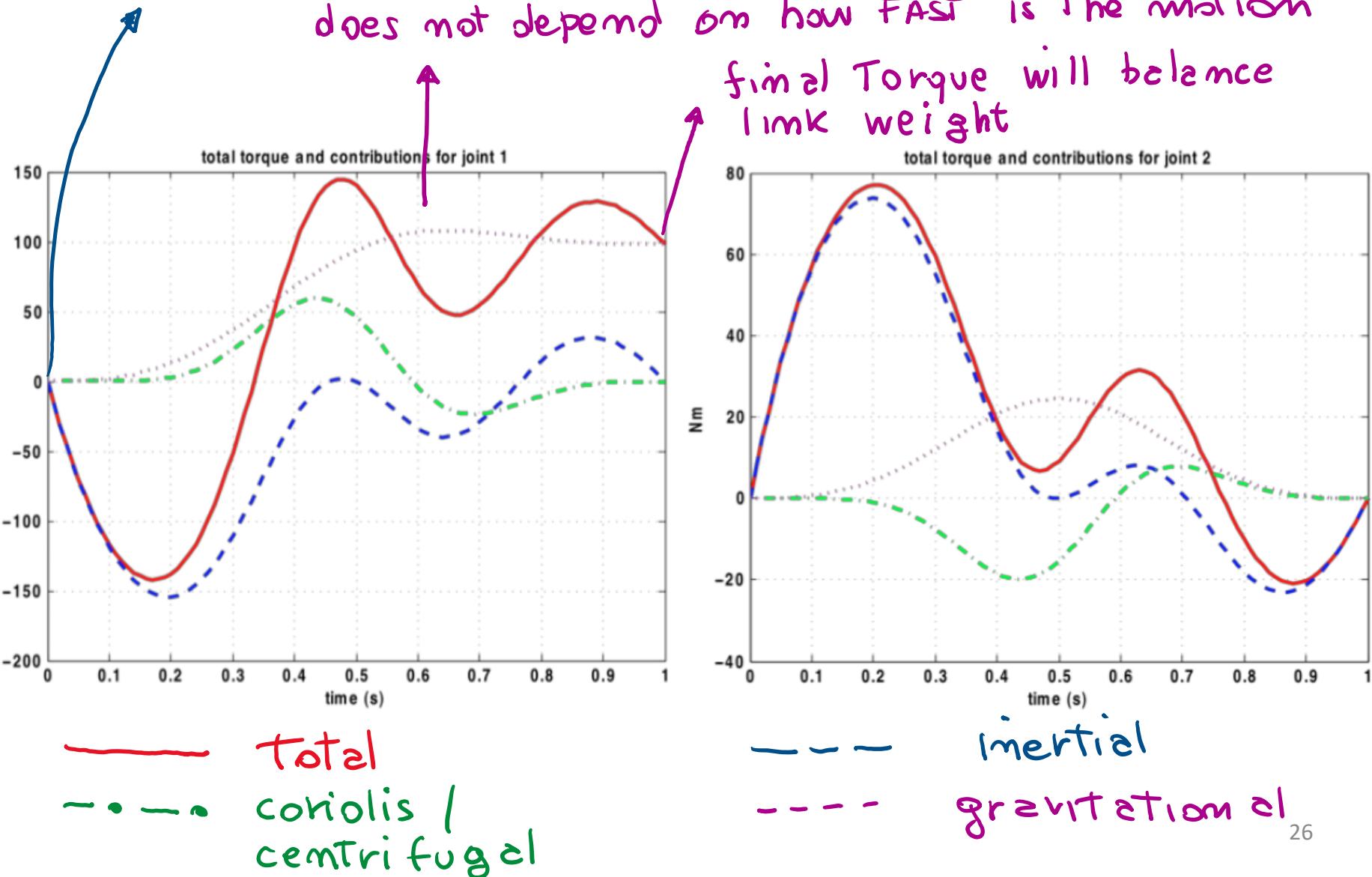
Torque contributions (uniform rods of mass of $m_1=10 \text{ kg}$ $m_2=5 \text{ kg}$)

inertial Torque is zero at beginning / end

because The acceleration is zero

does not depend on how FAST is The motion

final Torque will balance link weight



USE OF RNEA FOR DIRECT DYNAMICS (SIMULATION)

- Ⓐ compute bias Terms $\vec{h}(\vec{q}, \dot{\vec{q}})$ (coriolis/centrif. + gravity)

$$\vec{h} = \text{RNEA}(0g, \vec{q}, \dot{\vec{q}}, 0) \rightarrow O(m)$$

↳ also known as non-linear effect

- Ⓑ compute inertia matrix

$$M_i = \text{RNEA}(0, \vec{q}, 0, e_i) \quad i=1, \dots, n \Rightarrow M(\vec{q}) \rightarrow O(m^3)$$

- Ⓒ compute accelerations

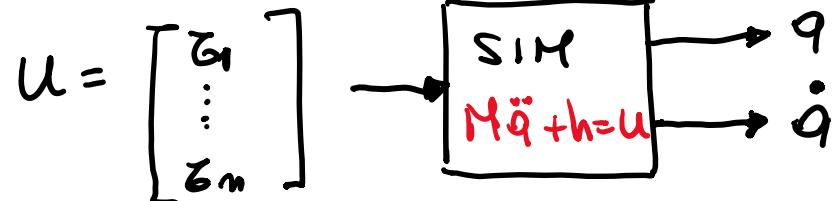
$$\ddot{\vec{q}} = M(\vec{q})^{-1} (\vec{u} - \vec{h})$$

$O(m^3)$

\vec{u} = vector of input
Torques (eg. from
controller)

- Ⓓ integrate $\ddot{\vec{q}}_k$ (RK4, forward Euler) $\Rightarrow \vec{q}_{k+1}, \dot{\vec{q}}_{k+1}$

- Ⓔ iterate



FORWARD / EXPLICIT EULER INTEGRATION METHOD

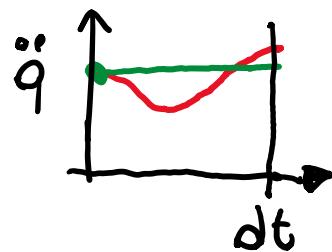
GOAL: To integrate accelerations into velocities / positions

Taylor approximation: a function at $t + \Delta t$ can be approximated by a polynomial centered at t :

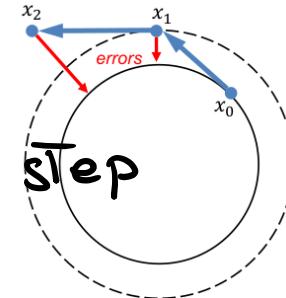
$$f(t + \Delta t) = f(t) + \Delta t f'(t) + \frac{1}{2!} \Delta t^2 f''(t) + \dots$$

⇒ forward Euler is a 1^o order method

ASSUMPTION: constant acceleration during time step



⇒ approximated forward = assumed known for the whole time step alt



$$\dot{q}(t + \Delta t) = \dot{q}(t) + \Delta t \ddot{q}(t)$$

$$q(t + \Delta t) = q(t) + \Delta t \dot{q}(t)$$

FORWARD
EULER

Since we already know we have a second order system we can directly integrate position from accel.:

$$\dot{q} = \int \ddot{q} dt = \int \ddot{q} t + \dot{q}(0) dt = \frac{t^2}{2} \ddot{q} + \dot{q}(0)t + q(0)$$

So we can get:

$$\dot{q}(t + dt) = \dot{q}(t) + dt \ddot{q}(t)$$

$$q(t + dt) = q(t) + \dot{q}(t) dt + \frac{dt^2}{2} \ddot{q}(t)$$

IMPROVED
FORWARD /
EXPLICIT
EULER

- ⊕ easy to implement / understand
- ⊕ computationally cheap
- ⊖ low accuracy (1^o order integration step)
→ higher order methods could be used, not necessary for free motion

⊖ large $dt \Rightarrow$ large integration error

We assume constant acceleration but in reality it varies because it depends on state

$$\ddot{q} = M(q)^{-1}(z - h(q, \dot{q}))$$

↓ constant on dt

⊖ unsuitable for "stiff" differential equations
(e.g. when you have discontinuities or different time constants)

COULOMB FRICTION

- important for realistic simulations
- makes differential equations stiff \Rightarrow reduce dt
 \Rightarrow better integration method

$$\zeta_c = \begin{cases} -\zeta_c^{\max} \operatorname{sgn}(\dot{q}) & \dot{q} \neq 0 \\ R - \zeta & \text{if } \dot{q} = 0 \wedge |h - \zeta| < \zeta_s^{\max} \\ \zeta_c^{\max} \operatorname{sgn}(h - \zeta) & \text{otherwise} \end{cases}$$

