Multi-Contact Planning

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Disney Research Pittsburgh, August 19, 2011

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- 3 Sequence-of-stances planning problem
- 4 Motion Synthesis
- 5 Extension to linear-elasticity models





2 IK Solver

3 Sequence-of-stances planning problem

4 Motion Synthesis

5 Extension to linear-elasticity models

Targeted applications

- legged locomotion
- dexterous manipulation
- dual arm manipulation
- collaborative tasks
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System

We consider systems made of N entities:

- humanoid robots
- dexterous fingers
- anthropomorphic arms
- manipulated objects
- and the environment

$$r \in \{1, \ldots, N\}$$

each entity $r \in \{1, \dots, N\}$ is represented as a kinematic tree

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Definitions and Notations IK Solver Motion Synthesis

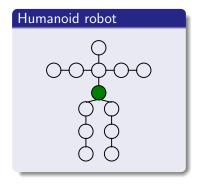
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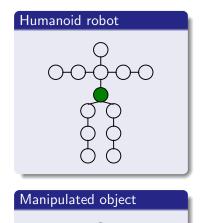
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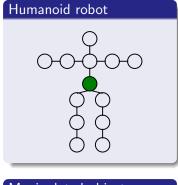
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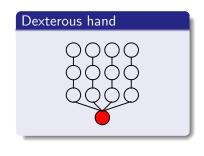


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Manipulated object

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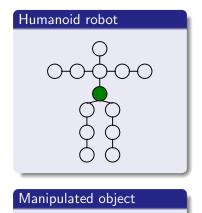
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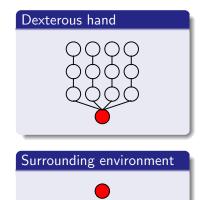
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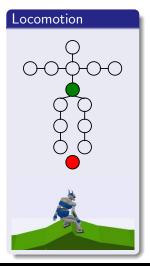
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The system is an assembling of an arbitrary number N of entities

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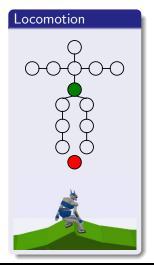
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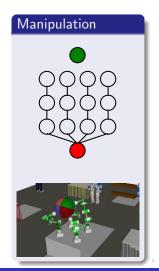


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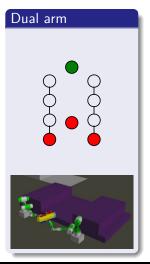




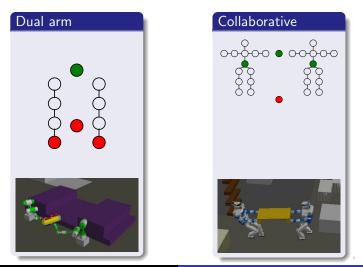
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The system is an assembling of an arbitrary number N of entities



The system is an assembling of an arbitrary number N of entities



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Multi-Contact Planning

Configuration space

The configuration space of the system in the Cartesian product of the respective configuration spaces of the entities

$$\mathscr{C} = \prod_{r=1}^{N} \mathscr{C}_r$$

An entity's configuration space \mathscr{C}_r can take different forms

$$\begin{cases} \mathscr{C}_r = \mathbb{R}^k &, \text{ for a fixed-base robot} \\ \mathscr{C}_r = SE(3) \times \mathbb{R}^k &, \text{ for a non-fixed-base robot} \\ \mathscr{C}_r = SE(3) &, \text{ for a manipulated object} \\ \mathscr{C}_r = \{0\} &, \text{ for a fixed environment object} \end{cases}$$

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Configuration

$$q\in \mathscr{C}=\prod_{r=1}^{N} \mathscr{C}_r$$
 $q=(q_1,\ldots,q_r)$

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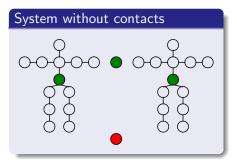
Contact

A contact can be defined between any two nodes of the system (even within same entity). Contacts can be unilateral or bilateral.

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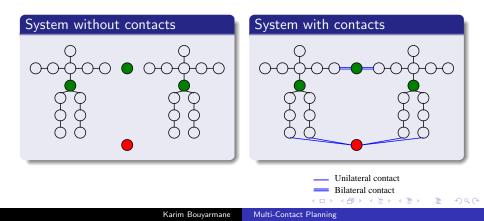
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Contact

A contact c is a 7-tuple

$$c = (r_1, s_1, r_2, s_2, x, y, \theta) \in \mathbb{N}^4 \times SE(2)$$

The set of all contacts is denoted $E_{contacts}$

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Stance

A stance σ is a set of contacts

$$\sigma = \{c_1, \ldots, c_n\}$$

The set of all stances is denoted $\Sigma \subset 2^{\textit{E}_{\rm contacts}}$

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Forward kinematics mapping

$$p_{\Sigma}: \mathscr{C} \to \Sigma$$

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Inverse kinematics mapping

$$\mathscr{Q}_{\sigma} = p_{\Sigma}^{-1}(\sigma)$$

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Forward kinematics mapping

$$p_{\Sigma}: \mathscr{C} \to \Sigma$$

Inverse kinematics mapping

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Feasible space

$$\mathscr{F}_{\sigma} \subset \mathscr{Q}_{\sigma}$$

such that $\forall q \in \mathscr{F}_{\sigma}$, q is in static equilibrium.

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Adjacent stances

$$\sigma' \in \operatorname{Adj}^+(\sigma) \text{ if } \sigma' \supset \sigma \text{ and } \operatorname{card}(\sigma') = \operatorname{card}(\sigma) + 1.$$

 $\sigma' \in \operatorname{Adj}^-(\sigma) \text{ if } \sigma' \subset \sigma \text{ and } \operatorname{card}(\sigma') = \operatorname{card}(\sigma) - 1.$

$$\operatorname{Adj}(\sigma) = \operatorname{Adj}^+(\sigma) \cup \operatorname{Adj}^-(\sigma)$$

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On $\operatorname{Adj}^+(\sigma)$ we define an equivalence relation \sim_{σ} which leaves the position (x, y, θ) of the added contact undetermined.

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 $\bullet\,$ each equivalence class $[\sigma']$ is isomorphic to $\mathbb{R}^2\times\mathbb{S}^1$

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Feasible sequence of stances

$$(\sigma_1,\ldots,\sigma_n)\in\Sigma^n$$

such that

$$\forall i \in \{1,\ldots,n-1\} \quad \sigma_{i+1} \in \mathrm{Adj}(\sigma_i) \text{ and } \mathscr{F}_{\sigma_i} \cap \mathscr{F}_{\sigma_{i+1}} \neq \varnothing$$

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Two problems

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Two problems

IK problem

Given a stance, find a feasible configuration.

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Two problems

IK problem

Given a stance, find a feasible configuration.

sequence-of-stances planning problem

Given start and goal stances, find a feasible sequence of stances.

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2 IK Solver

3 Sequence-of-stances planning problem

4 Motion Synthesis

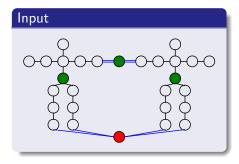
5 Extension to linear-elasticity models

Problem

Given a set of contacts between multiple entities (robots, objects to manipulate, surrounding environment), find a configuration of the whole system satisfying static equilibrium conditions for all the entities.

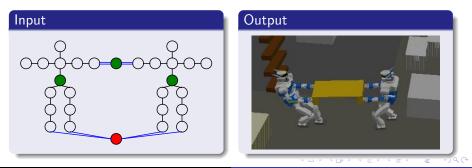
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Related work

Indirectly related work (more suitable to rejection sampling)

- Closed kinematic chains sampling (LaValle99, Han00, Cortes02)
- Static equilibrium tests (Bretl08, Rimon08)
- Contact forces optimization (Boyd07)

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Related work

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Directly related work

- Posture generation (Escande06)
- Iterative constraints enforcement (Hauser05)

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Directly related work

- Posture generation (Escande06)
- Iterative constraints enforcement (Hauser05)

Our contributions

- More general contact configurations (non-horizontal, non-coplanar, frictional contacts)
- Torque limits as constraints (versus post-rejection in the case of Hauser05)
- Multi-agent systems, non-fixed contact supports

Problem variables

The variables of the problem are made of

- the configuration variables q
- the contact forces variables λ

Total variables

 (q, λ)

Configuration variables q

Configuration variables

$$q\in \mathscr{C}=\prod_{r=1}^{N}\mathscr{C}_{r}$$

$$q=(q_1,\ldots,q_r)$$

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Contact forces variables λ

Let us suppose we have *n* contact points $c \in \{1, \ldots, n\}$

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Contact forces variables λ

Let us suppose we have *n* contact points $c \in \{1, \ldots, n\}$

Contact model

At each contact point c we consider a discretized friction cone with generators K_c . The contact force is then

$$f_c = \lambda_c^T K_c$$

with λ_c a vector of positive real numbers

$$\lambda_{c} \geq 0$$

Contact forces variables λ

Contact forces variables

$$\lambda = (\lambda_c)_{c \in \{1, \dots, n\}}$$

$$\lambda = (\lambda_1, \ldots, \lambda_n)$$

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Optimization formulation

 $\min_{\boldsymbol{q},\lambda} \operatorname{obj}(\boldsymbol{q},\lambda)$

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Optimization formulation

 $\min_{q,\lambda} \operatorname{obj}(q,\lambda)$

The objective function

$$\operatorname{obj}(\boldsymbol{q}, \boldsymbol{\lambda}) = \alpha \|\boldsymbol{q} - \boldsymbol{q}_{\operatorname{ref}}\|^2 + \beta \|\boldsymbol{\lambda}\|^2 + \gamma \|\boldsymbol{\tau}\|^2$$

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Optimization formulation

 $\min_{\boldsymbol{q},\lambda} \operatorname{obj}(\boldsymbol{q},\lambda)$

The objective function

$$\operatorname{obj}(\boldsymbol{q}, \boldsymbol{\lambda}) = \alpha \|\boldsymbol{q} - \boldsymbol{q}_{\operatorname{ref}}\|^2 + \beta \|\boldsymbol{\lambda}\|^2 + \gamma \|\boldsymbol{\tau}\|^2$$

Constraints

- Static equilibrium for all non-fixed-base entities
- Joint limits for all joints
- Torque limits for all joint actuators
- Newton's third law
- $\lambda_c \ge 0$ for all unilateral contacts c
- Collision-free

Solver

We use IPOPT as a black-box non-linear optimization solver. Requires methods for computing the gradient.

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Solver

We use IPOPT as a black-box non-linear optimization solver. Requires methods for computing the gradient.

Gradient computations

All the gradient computations are based on the algorithm providing the Kinematic Jacobian J

$$\dot{x} = J\dot{\theta}$$

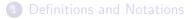
cf. paper for details, especially concerning the gradient of the torque limit constraint based on the symbolic differentiation of the Kinematic Jacobian J (Bruynincks96)

Example videos (external player)

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Problem

Given $\sigma_{\text{start}}, \sigma_{\text{goal}} \in \Sigma$ find a feasible sequence of stances $(\sigma_1, \ldots, \sigma_n)$ such that $\sigma_1 = \sigma_{\text{start}}$ and $\sigma_n = \sigma_{\text{goal}}$. i.e. such that

- $\sigma_1 = \sigma_{\text{start}}$
- $\sigma_n = \sigma_{\text{goal}}$
- $\forall i \in \{1, \ldots, n-1\}$ $\sigma_{i+1} \in \operatorname{Adj}(\sigma_i)$
- $\forall i \in \{1, \dots, n-1\}$ $\mathscr{F}_{\sigma_i} \cap \mathscr{F}_{\sigma_{i+1}} \neq \varnothing$

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Related work

- (Escande 2006) locomotion for a single humanoid robot.
- (Hauser 2005) discretization of candidate contact locations on the environment.

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Related work

- (Escande 2006) locomotion for a single humanoid robot.
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Our contributions

- More general systems
- More general contact configurations (non-horizontal, non-coplanar, frictional contacts, bilateral contacts, non-fixed contact locations)
- Unified framework for locomotion and manipulation

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Best-First algorithm

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Best-First algorithm

• initialize priority queue $\textit{Q} \leftarrow \{\sigma_{\mathrm{start}}\}$

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Best-First algorithm

• initialize priority queue $\textit{Q} \leftarrow \{\sigma_{\mathrm{start}}\}$

loop

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Best-First algorithm

• initialize priority queue $\textit{Q} \leftarrow \{\sigma_{\mathrm{start}}\}$

loop

• pop best stance σ from ${\it Q}$

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Best-First algorithm

• initialize priority queue $\textit{Q} \leftarrow \{\sigma_{\mathrm{start}}\}$

loop

- pop best stance σ from Q
- for all $[\sigma'] \in \operatorname{Adj}^+(\sigma)_{/\sim_{\sigma}}$

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Best-First algorithm

• initialize priority queue $\textit{Q} \leftarrow \{\sigma_{\mathrm{start}}\}$

loop

- pop best stance σ from Q
- for all $[\sigma'] \in \operatorname{Adj}^+(\sigma)_{/\sim_{\sigma}}$
 - call the IK solver to find q in $\mathscr{F}_{\sigma} \cap \mathscr{F}_{[\sigma']}$

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Best-First algorithm

• initialize priority queue $\textit{Q} \leftarrow \{\sigma_{\mathrm{start}}\}$

loop

- pop best stance σ from Q
- for all $[\sigma'] \in \operatorname{Adj}^+(\sigma)_{/\sim_{\sigma}}$
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 - upon success push $\sigma' = p_{\Sigma}(q)$ into Q

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Best-First algorithm

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$$\sigma' \in \operatorname{Adj}^-(\sigma)$$

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• for all
$$\sigma' \in \operatorname{Adj}^-(\sigma)$$

• call the IK solver to find q in $\mathscr{F}_{\sigma} \cap \mathscr{F}_{\sigma'}$

- **→** → **→**

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 - upon success push σ' into Q

• until σ is close enough to σ_{goal}

Example videos (External player)

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Problem

Given a feasible sequence of stances, synthesize a physically valid motion for the robot that realizes the steps.

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Related work

- (Abe, da Silva, Popovic 2007) Multi-objective control with frictional contacts
- (de Lasa, Mordatch, Hertzmann 2010) Feature-based locomotion controller

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Related work

- (Abe, da Silva, Popovic 2007) Multi-objective control with frictional contacts
- (de Lasa, Mordatch, Hertzmann 2010) Feature-based locomotion controller

Our contributions

- Changing contact configurations
- Acyclic non-gaited motion

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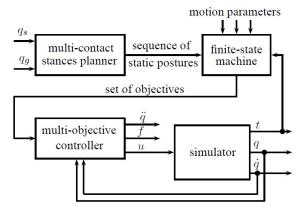
Our contributions

- Changing contact configurations
- Acyclic non-gaited motion

Restrictions

Locomotion only

Overview



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Multi-objective Control

Quadratic objective

$$\min_{\ddot{q},\lambda,\tau}\sum_{i}w_{i}\,||\ddot{g}_{i}-\ddot{g}_{i}^{\text{desired}}||^{2}$$

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Multi-objective Control

Quadratic objective

$$\min_{\ddot{q},\lambda,\tau}\sum_{i}w_{i}\,||\ddot{g}_{i}-\ddot{g}_{i}^{\mathrm{desired}}||^{2}$$

Linear constraints

Dynamics equation

$$M(q)\ddot{q} + N(q,\dot{q}) = S \tau + J^T \lambda$$

• Maintaining Contacts

$$J\ddot{q}+\dot{J}\dot{q}=0$$

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Finite state machine

Kinds of objectives

- regulation around a fixed point
- steering to a target position/velocity in a given time

applied to

- CoM (when removing a contact)
- Link going to make a contact
- posture to solve redundancy

Finite state machine

Kinds of objectives

- regulation around a fixed point
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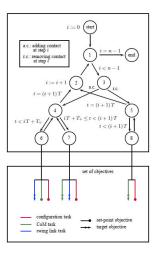
applied to

- CoM (when removing a contact)
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- posture to solve redundancy

Finite state machine

At every time step of the simulation a finite state machine feeds the controller with the objectives depending on the current state along the sequence of stances

the FSM



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Example videos (external player)

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2 IK Solver

3 Sequence-of-stances planning problem

4 Motion Synthesis



Problem

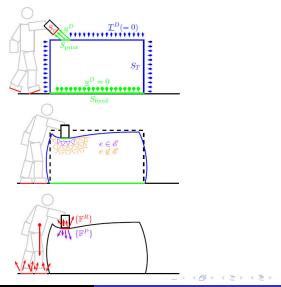
solve the IK problem in case one of the contacts is made on a deformable support.

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Overview



Linear elasticity equations

$$\underline{\underline{\varepsilon}}(\underline{x}) = \frac{1}{2} \left(\nabla \underline{u} + \nabla^{T} \underline{u} \right)(\underline{x}),$$

$$\operatorname{div} \underline{\underline{\sigma}}(\underline{x}) + \rho \underline{f}(\underline{x}) = 0,$$

$$\underline{\underline{\sigma}}(\underline{x}) = \underline{\underline{\mathcal{A}}} : \underline{\underline{\varepsilon}}(\underline{x}),$$

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Boundary conditions

$$\underline{\underline{\sigma}}(\underline{x}) \cdot \underline{\underline{n}}(\underline{x}) = \underline{\underline{T}}^{D}(\underline{x}) \quad (\underline{x} \in S_{T}),$$
$$\underline{\underline{u}}(\underline{x}) = \underline{\underline{u}}^{D}(\underline{x}) \quad (\underline{x} \in S_{u}),$$

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Weak formulation

$$\int_{\Omega} \underline{\underline{\varepsilon}}[\underline{u}] : \underline{\underline{\mathcal{A}}} : \underline{\underline{\varepsilon}}[\underline{w}] \, dV = \int_{\Omega} \rho \underline{\underline{f}} \cdot \underline{\underline{w}} \, dV + \int_{S_{\mathcal{T}}} \underline{\underline{T}}^{D} \cdot \underline{\underline{w}} \, dS \,,$$

Weak formulation

$$\int_{\Omega} \underline{\underline{\varepsilon}}[\underline{u}] : \underline{\underline{\mathcal{A}}} : \underline{\underline{\varepsilon}}[\underline{w}] \, dV = \int_{\Omega} \rho \underline{\underline{f}} \cdot \underline{\underline{w}} \, dV + \int_{S_{\tau}} \underline{\underline{T}}^{D} \cdot \underline{\underline{w}} \, dS \,,$$

Approximation using the Galerkin method

$$[\mathbb{K}^{\mathsf{F}}]\{\mathbb{U}^{\mathsf{F}}\}+[\mathbb{K}^{\mathsf{D}}]\{\mathbb{U}^{\mathsf{D}}\}=0\,,$$

which can be rewritten as

$$\{\mathbb{U}\} = [\mathbb{K}]\{\mathbb{U}^D\}.$$

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Weak formulation

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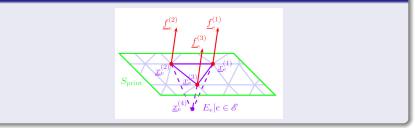
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$$\{\mathbb{U}\} = [\mathbb{K}]\{\mathbb{U}^D\}.$$

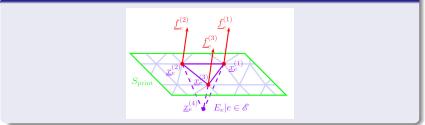
the FEM method

the FEM method allows to compute $[\mathbb{K}]$ through computing some other intermediate matrices $[D], [A], [B_e], [\mathbb{K}_e]$ (please see paper for the details)

Nodal Reaction Forces



Nodal Reaction Forces



Problem

relate the nodal reaction forces f_e to the deformation $\{\mathbb{U}^D\}$ in order to compute the gradient of the new static-equilibrium constraint.

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The analytic relation

$$\underline{f}_e^{(j)}(q) = -\frac{\alpha_e}{3} \left(\underline{n}_e(q)^T \otimes I_{3\times 3} \right) [D][A][B_e][\mathbb{K}_e] \{ \mathbb{U}^D(q) \} \,.$$

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The analytic relation

$$\underline{f}_{e}^{(j)}(q) = -\frac{\alpha_{e}}{3} \left(\underline{n}_{e}(q)^{T} \otimes I_{3\times 3} \right) [D][A][B_{e}][\mathbb{K}_{e}] \{ \mathbb{U}^{D}(q) \} .$$

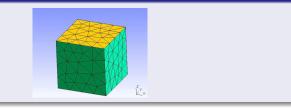
Its gradient

$$\begin{split} \frac{\partial \underline{f}_{e}^{j}}{\partial q} &= \\ &- \frac{\alpha_{e}}{3} \left[\left(\left[\frac{\partial \underline{n}_{e}}{\partial q_{i}} \right]^{T} \otimes I_{3 \times 3} \right) [D][A][B_{e}][\mathbb{K}_{e}] \{\mathbb{U}^{D} \} \right]_{i=1}^{\dim(q)} \\ &- \frac{\alpha_{e}}{3} \left(\underline{n}_{e}^{T} \otimes I_{3 \times 3} \right) [D][A][B_{e}][\mathbb{K}_{e}] \frac{\partial \{\mathbb{U}^{D}\}}{\partial q} \,. \end{split}$$

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the deformable support



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physical properties

Young's modulus E	10 ⁶ Pa
Poisson's ratio $ u$	0.4
Mass density $ ho$	$10^3 \mathrm{kg/m^3}$

Example videos (external player)

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conclusion

next

- More dynamic motion (reduced-model planning phase)
- Generalize motion generation to manipulation problems
- plan sequence of steps on linear elastic deformable support
- generate motion on deformable support
- ...

End of the presentation

Any questions?

Karim Bouyarmane Multi-Contact Planning

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