# Task-Space Inverse Dynamics: Implementation 

Optimization-based Robot Control

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- Force
- Actuation


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## HQP Solver

- solves a HQP


## Other Concepts

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- purely mathematical
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- contains robot model
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## Trajectory

- maps time to vector values
- pos, vel, acc
- position and velocity can have different sizes (Lie groups)


## Details

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- Bounds, represented by vectors $l b$ and $u b$ :

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TaskBase(string name, Model model);
Constraint compute(double t, Vector q, Vector v, Data data);

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Tasks can compute either:

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- inequality constraints, e.g., friction cones


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Force task:

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- e.g., friction cone constraints
- $A f \leq a$


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Force-Generator matrix $T$ :

- maps force variables to motion constraint representation
- Dynamic: $M \dot{v}+h=S^{\top} \tau+J^{\top} T f$
- Motion constraint: $J \dot{v}=-j_{V}$
- Friction cones: $A f \leq a$


## Contact6d

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## SOLUTION

- use 6 d representation for motion constraint $J \dot{v}=-j_{v} \in \mathbb{R}^{6}$
- but 12d representation for force variable $f \in \mathbb{R}^{12}$
- force-generator matrix $T \in \mathbb{R}^{6 \times 12}$ defines mapping between two representations: $\tau_{\text {contact }}=J^{\top} T f$


## InverseDynamicsFormulationBase

Central class of the whole library
Methods to add tasks:
addMotionTask(MotionTask task, double weight, int priority);
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HqpData defined as:

```
#typedef vector<pair<double, ConstraintBase>> ConstraintLevel
#typedef vector<ConstraintLevel> HqpData
```


## Examples

## Exercise 1

Open Terminal and execute:
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cd exercizes/notebooks
jupyter notebook

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- Add contact on hand


## Exercise 2: Balancing

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- Move reference CoM position


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- Push robot and check reaction


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- Move CoM over left foot


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