

# Planning Sequences of Motion Primitives for humanoid robots

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# Objective

- Plan motions for humanoid robot with manipulation of simple objects like:
  - ▶ doors,
  - ▶ windows,
  - ▶ drawers.
- Execute these motions using sensor feedback control.

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- Execute these motions using sensor feedback control.

# Approach

- Reduce complexity of manipulation planning:
  - ▶ “documented object”
- Plan motions as sequences of motion primitives

# Motion primitive

- Definition
  - ▶ Motion produced by a controller.
- Examples
  - ▶ walking along a curve,
  - ▶ walking on foot prints,
  - ▶ reaching with a hand.

# Documented objects

- Manipulating some objects requires some knowledge
  - ▶ opening a door requires
    - ★ to grasp the handle,
    - ★ to turn the handle,
    - ★ to pull the handle along a circular path,
    - ★ to cross the doorway,
    - ★ to grasp the other handle and release the first one,
    - ★ to pull the handle along a circular path,
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- We put this knowledge into the object thus defining the notion of
  - ▶ *documented object*.
- For each object, motion primitives manipulating the object can be precomputed and inserted in a global roadmap.

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# Example: going through a door

- Ideally, the knowledge is stored into the object as a sequence of time-varying tasks.
- Our implementation:
  - ▶ system: robot bounding box + door (3+1 dof),
  - ▶ algorithm: plan a sequence of motions satisfying successive constraints:
    - 1 no constraint,
    - 2 left hand is close to the handle,
    - 3 previous constraint + right hand close to other handle,
    - 4 right hand close to other handle,
    - 5 no constraint
  - ▶ generate step sequence along box path,
  - ▶ build a whole-body motion defined by
    - ★ step sequence,
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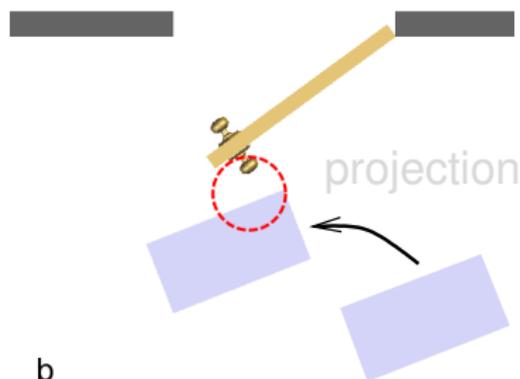
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# Motion Planning constraint

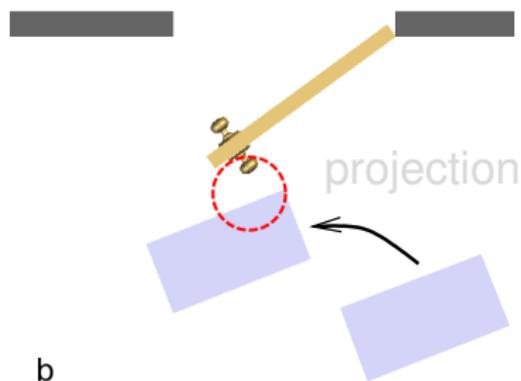
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- **Sampling:** projection function from configuration space to domain satisfying the constraint.



- b
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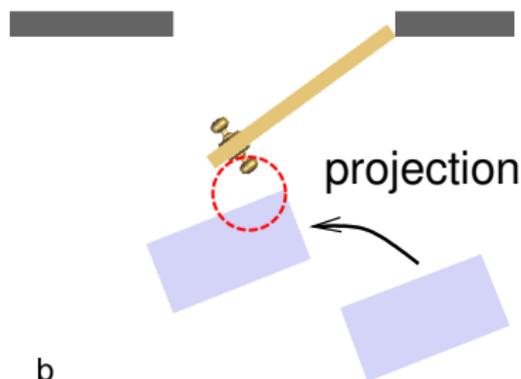
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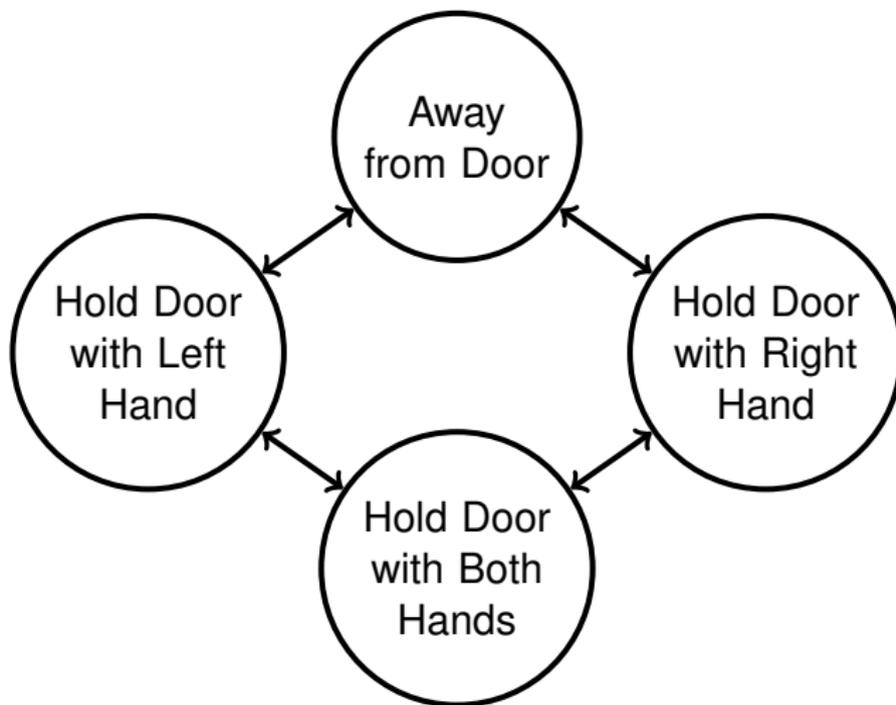
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# Going through a door: constraint transition graph



# Going through a door: algorithm

- Configuration space:

$SE(2) \times [\alpha_{min}, \alpha_{max}] \times \{\text{free, left hand, right hand, both hands}\}$

- Classical RRT algorithm with dedicated methods

- ▶ steering method: connect two configurations if
  - ★ states are adjacent in constraint graph,
  - ★ motion of object is consistent,
  - ★ enforce weaker constraint,
- ▶ distance function
  - ★ return  $\infty$  when two configurations cannot be connected,
- ▶ random configuration shooter: sample at intersections of constraint manifolds.

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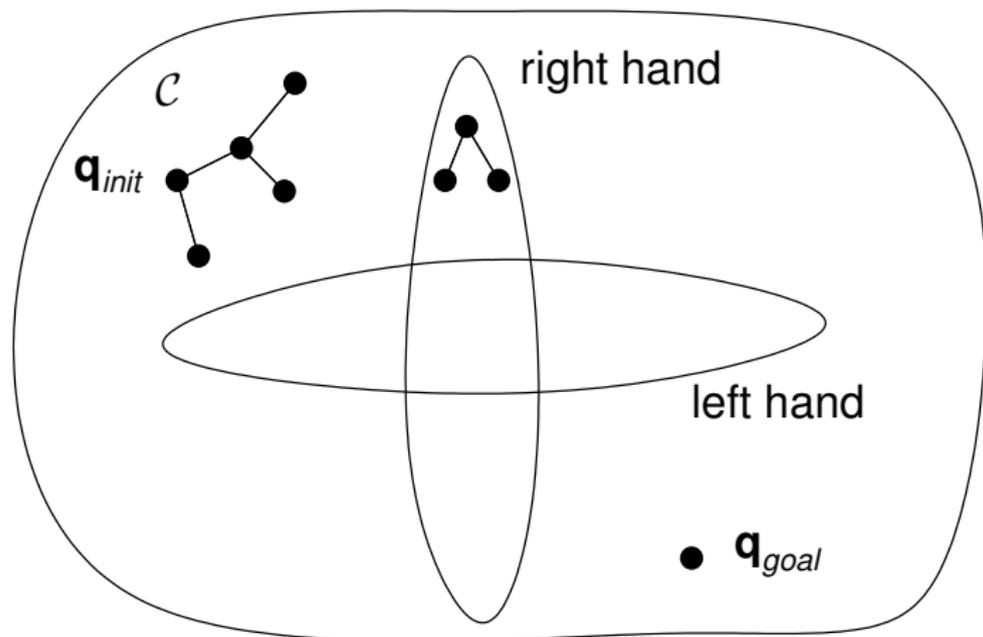
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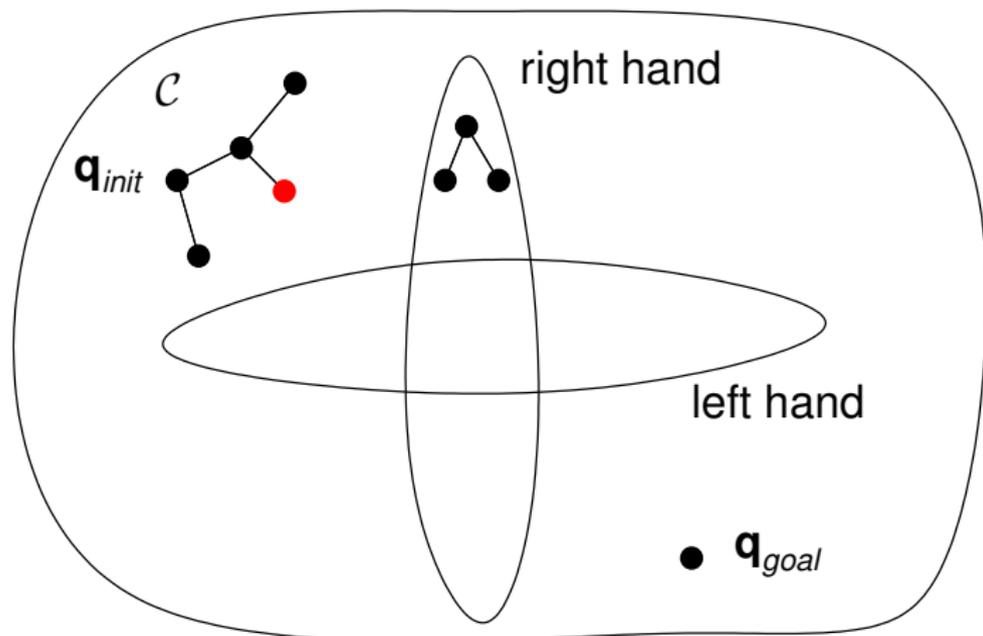
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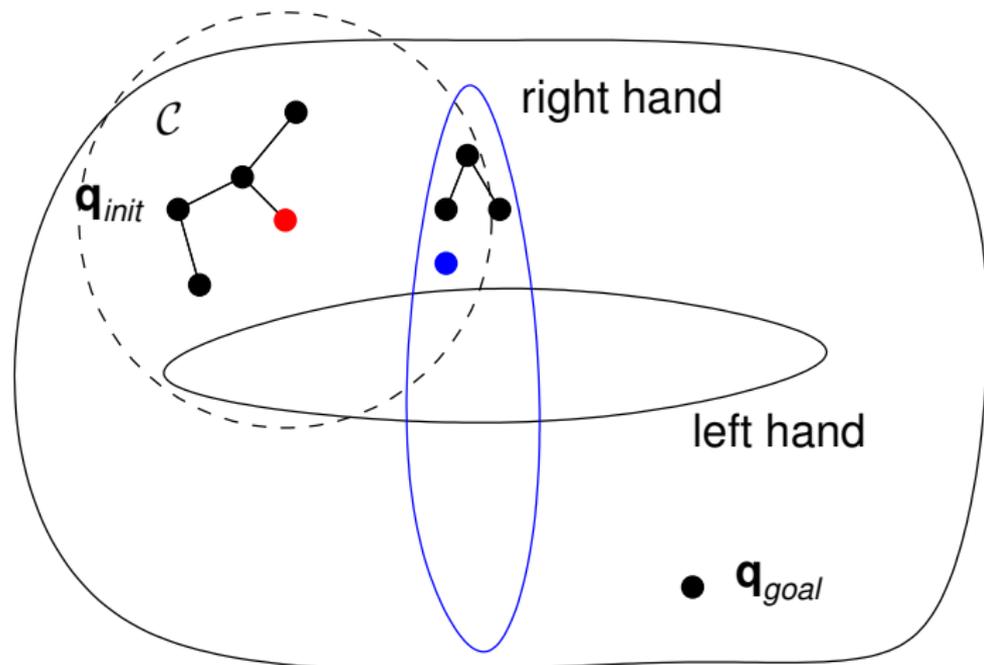


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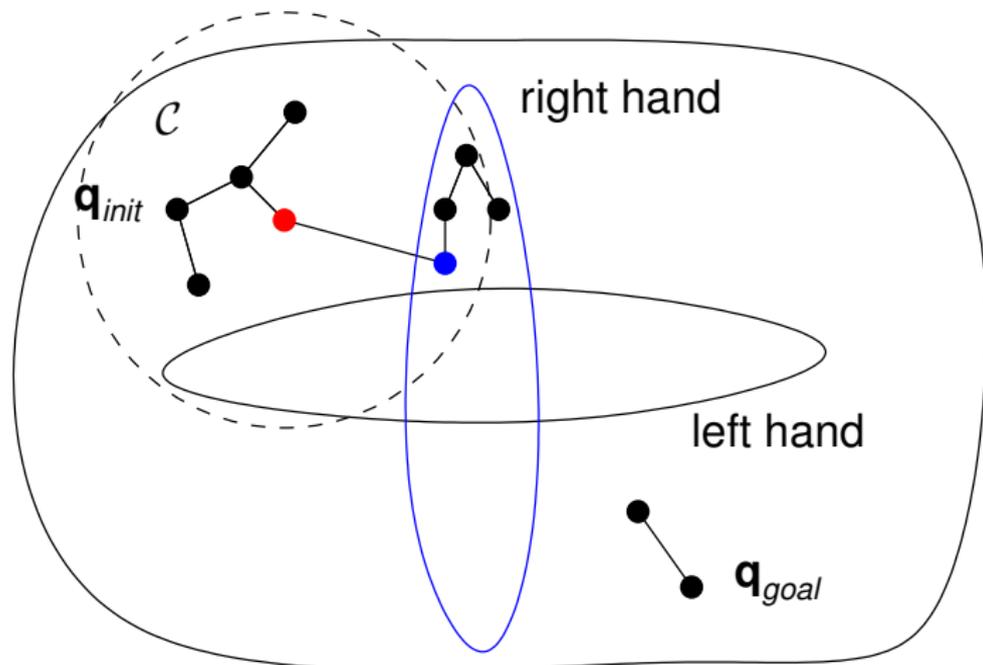
1. pick a random node

# Going through a door: algorithm



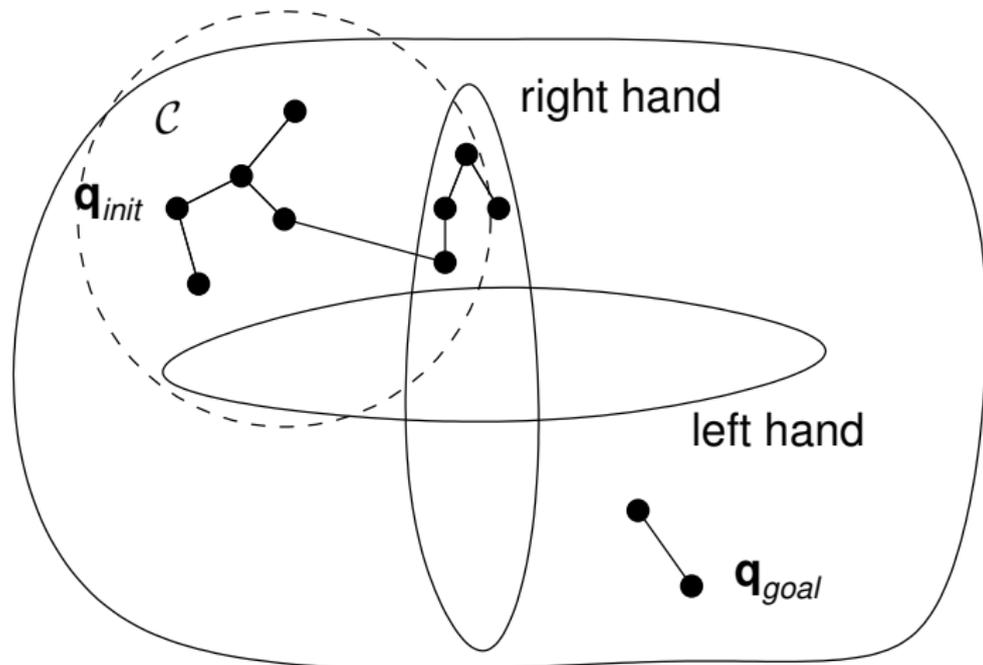
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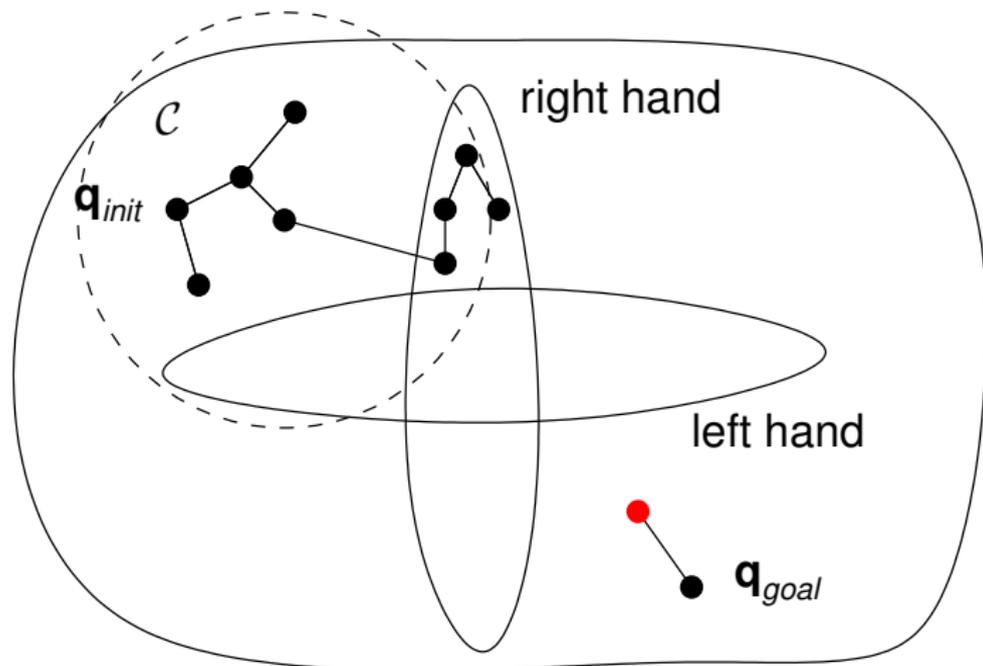


1. pick a random node
2. randomly sample a config about the node with the same object config
3. expand each connected component

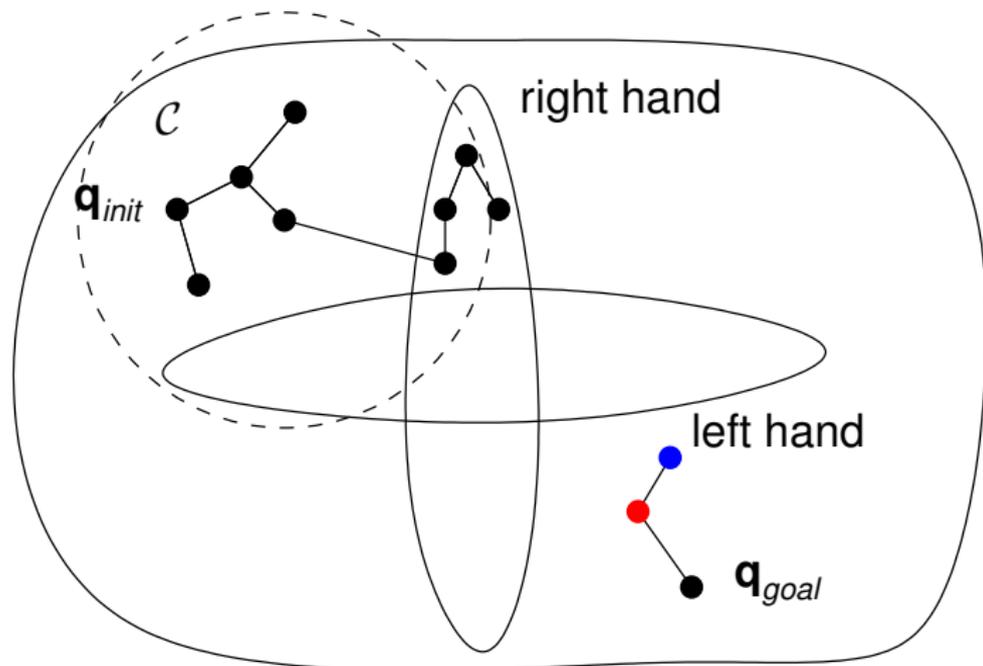
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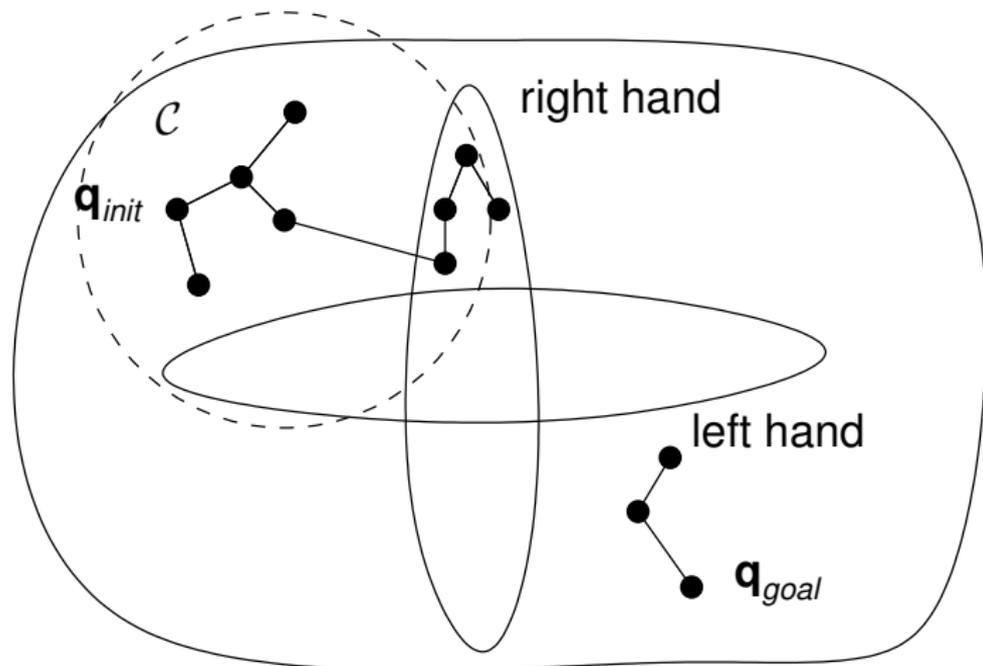
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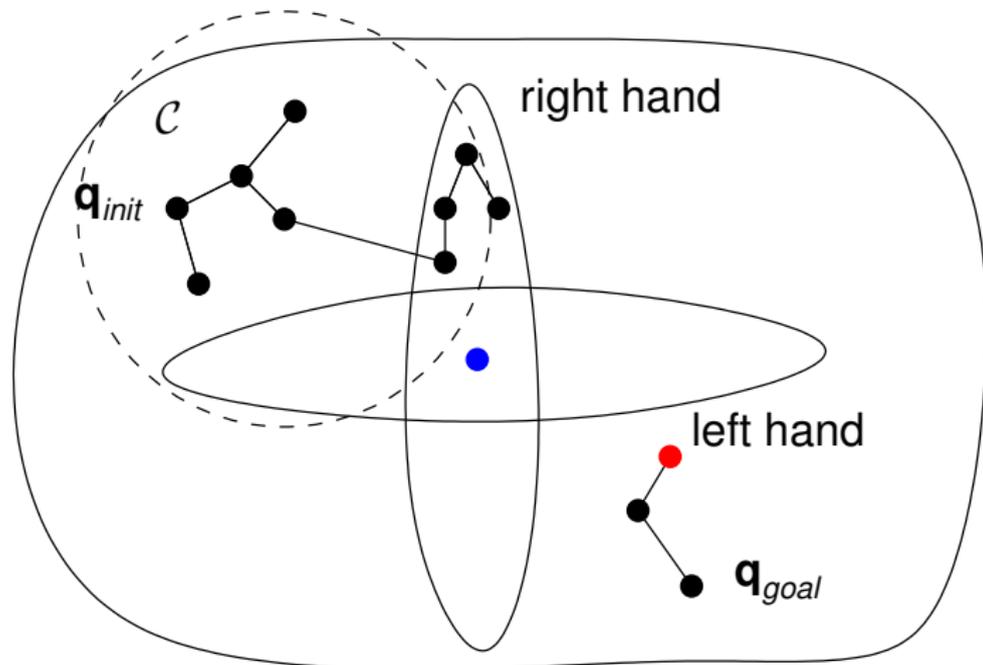
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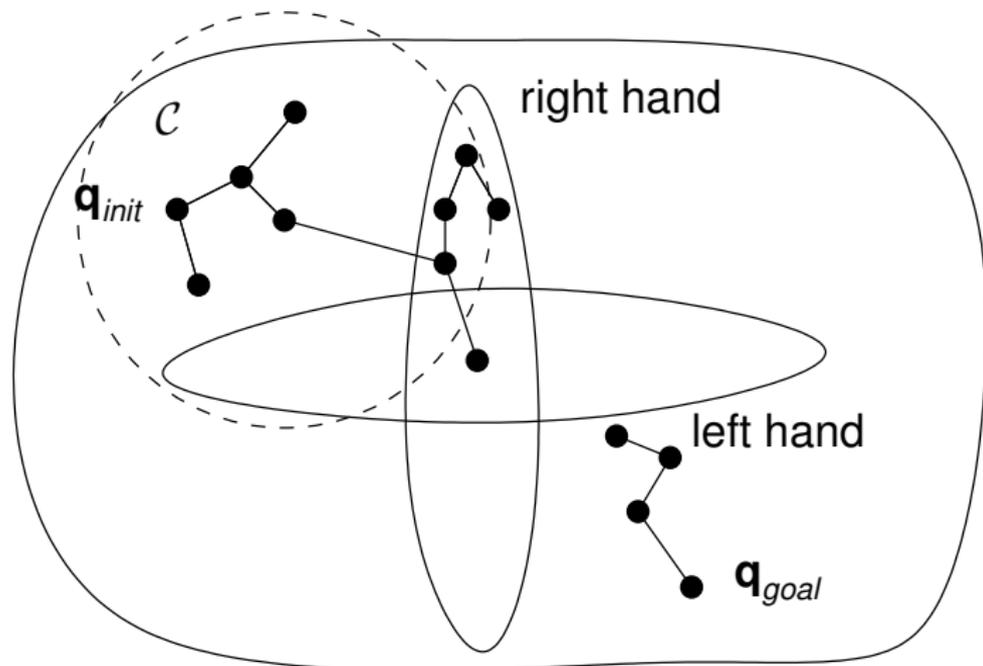
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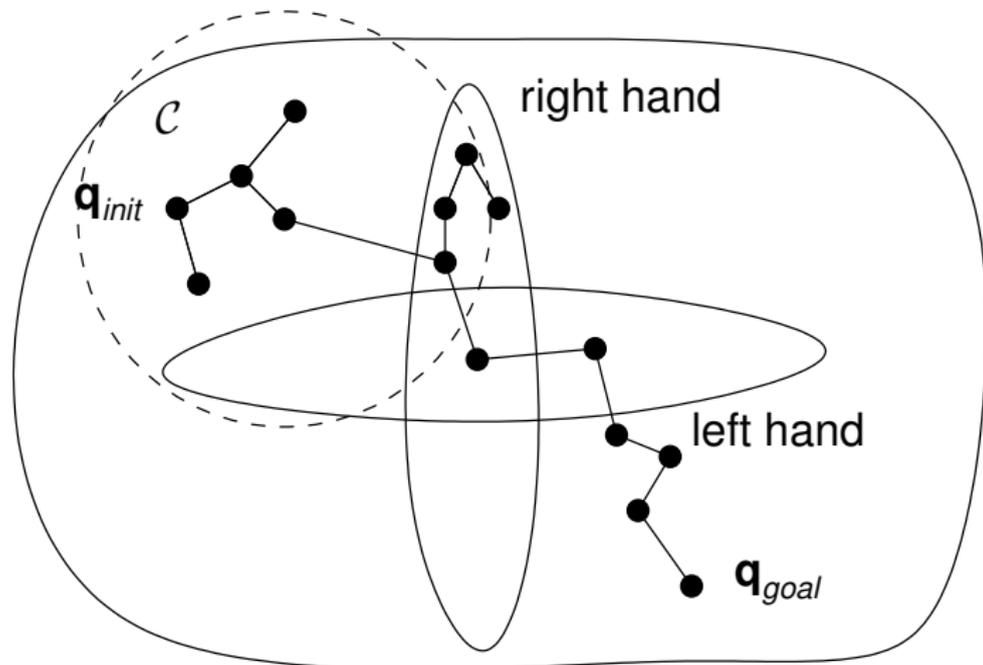
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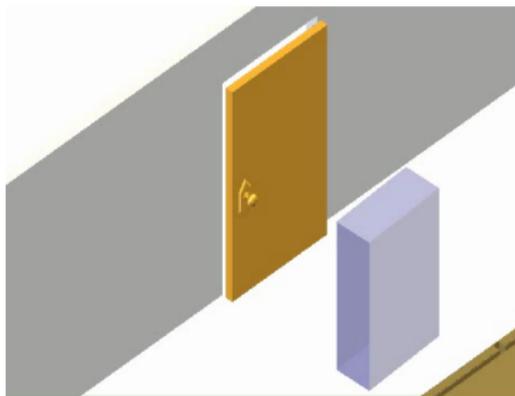
# Going through a door: algorithm



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# Going through a door: motion planning results



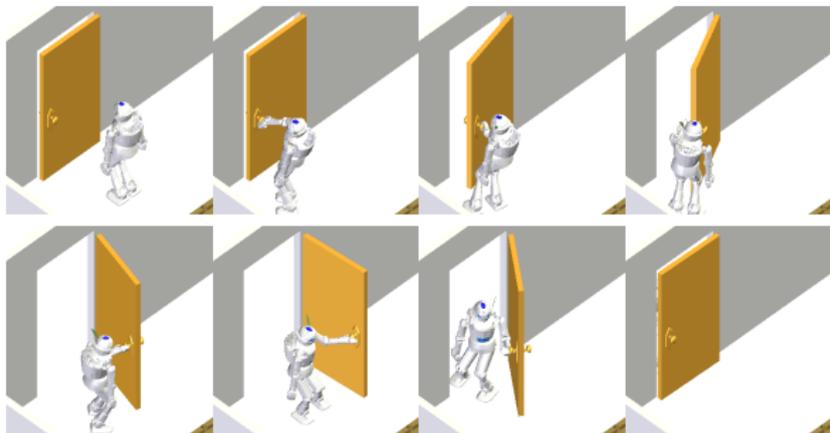
# Going through a door: whole-body animation

- Motion of the bounding box is converted into time parameterized
  - ▶ step sequence,
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- Resolution
  - ▶ step sequence → COM: preview control,
  - ▶ feet and upper body: inverse kinematics.

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# Going through a door: animation



# From motion of bounding box to motion primitives

- Objective
  - ▶ transform result of path planning into sequence of controllers.

# Hierarchical task based control framework

- Task
  - 1 Function of configuration to be controlled to 0,
  - 2 Jacobian of the function.
- Stack of tasks
  - ▶ tasks in decreasing order of priority,
  - ▶ compute velocity by cascade of pseudo inverses. [Siciliano, Slotine 1991]

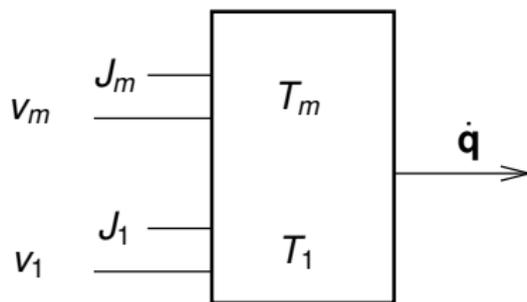


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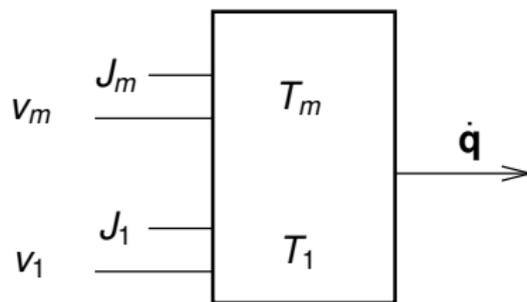


# Stack of tasks: collaboration with JRL -Tsukuba Japan



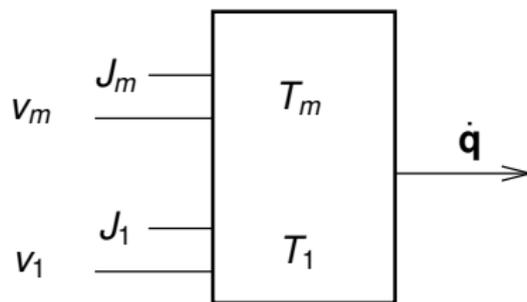
$$\dot{\mathbf{q}}_1 = -\lambda_1 \mathbf{J}_1^+ v_1 \rightarrow \dot{v}_1 = -\lambda_1 v_1$$

# Stack of tasks



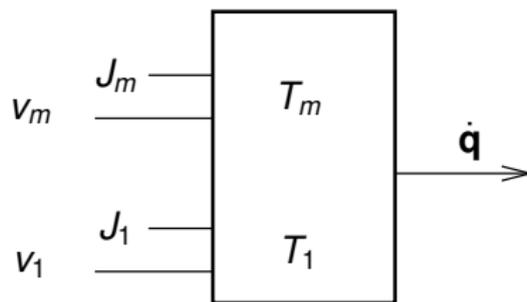
$$\begin{aligned} \dot{\mathbf{q}}_1 &= -\lambda_1 J_1^+ v_1 \rightarrow \dot{v}_1 = -\lambda_1 v_1 \\ \dot{\mathbf{q}}_i &= \quad -\lambda_i J_i \quad + v_i \end{aligned}$$

# Stack of tasks



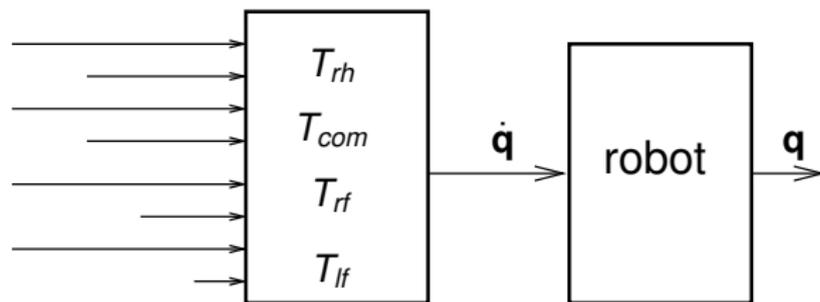
$$\begin{aligned}\dot{\mathbf{q}}_1 &= -\lambda_1 \mathbf{J}_1^+ \mathbf{v}_1 \rightarrow \dot{\mathbf{v}}_1 = -\lambda_1 \mathbf{v}_1 \\ \dot{\mathbf{q}}_i &= \dot{\mathbf{q}}_{i-1} - \lambda_i (\mathbf{J}_i \mathbf{P}_{i-1})^+ (\mathbf{v}_i - \mathbf{J}_i \dot{\mathbf{q}}_{i-1}) \\ \mathbf{P}_i &= \mathbf{P}_{i-1} - (\mathbf{J}_i \mathbf{P}_{i-1})^+ \mathbf{J}_i \mathbf{P}_{i-1}\end{aligned}$$

# Stack of tasks

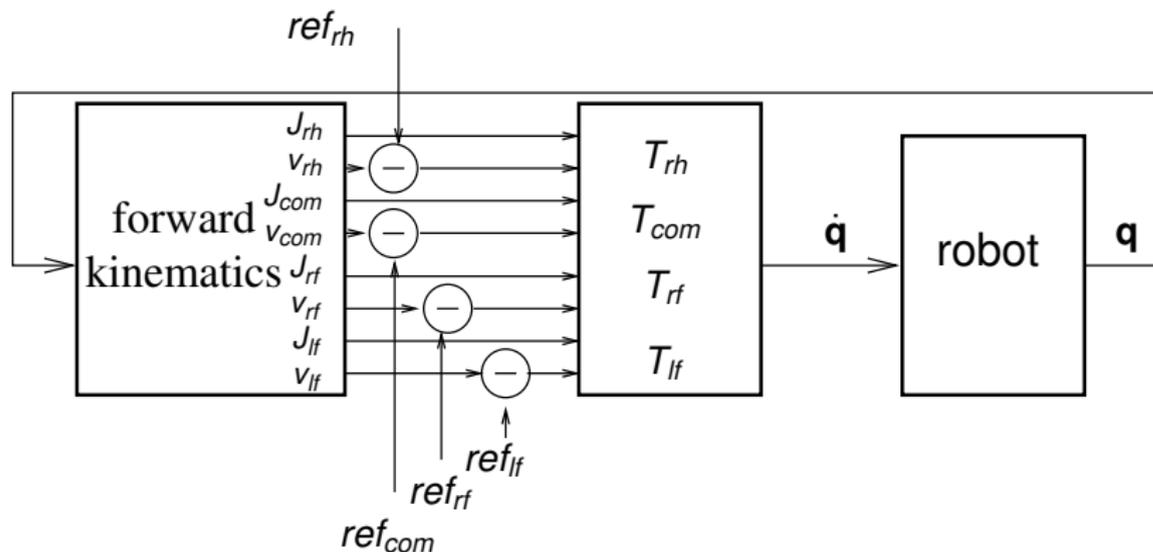


$$\begin{aligned}\dot{\mathbf{q}}_1 &= -\lambda_1 J_1^+ v_1 \rightarrow \dot{v}_1 = -\lambda_1 v_1 \\ \dot{\mathbf{q}}_i &= \dot{\mathbf{q}}_{i-1} - \lambda_i (J_i P_{i-1})^+ (v_i - J_i \dot{\mathbf{q}}_{i-1}) \\ P_i &= P_{i-1} - (J_i P_{i-1})^+ J_i P_{i-1} \\ \dot{\mathbf{q}} &= \dot{\mathbf{q}}_m\end{aligned}$$

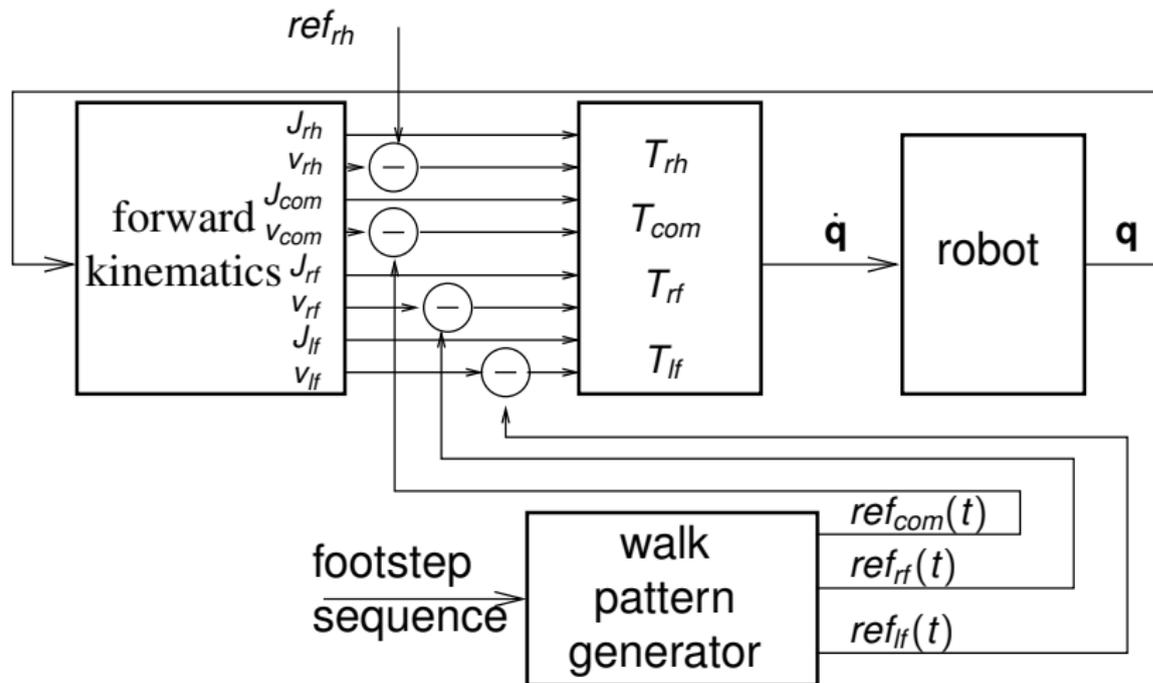
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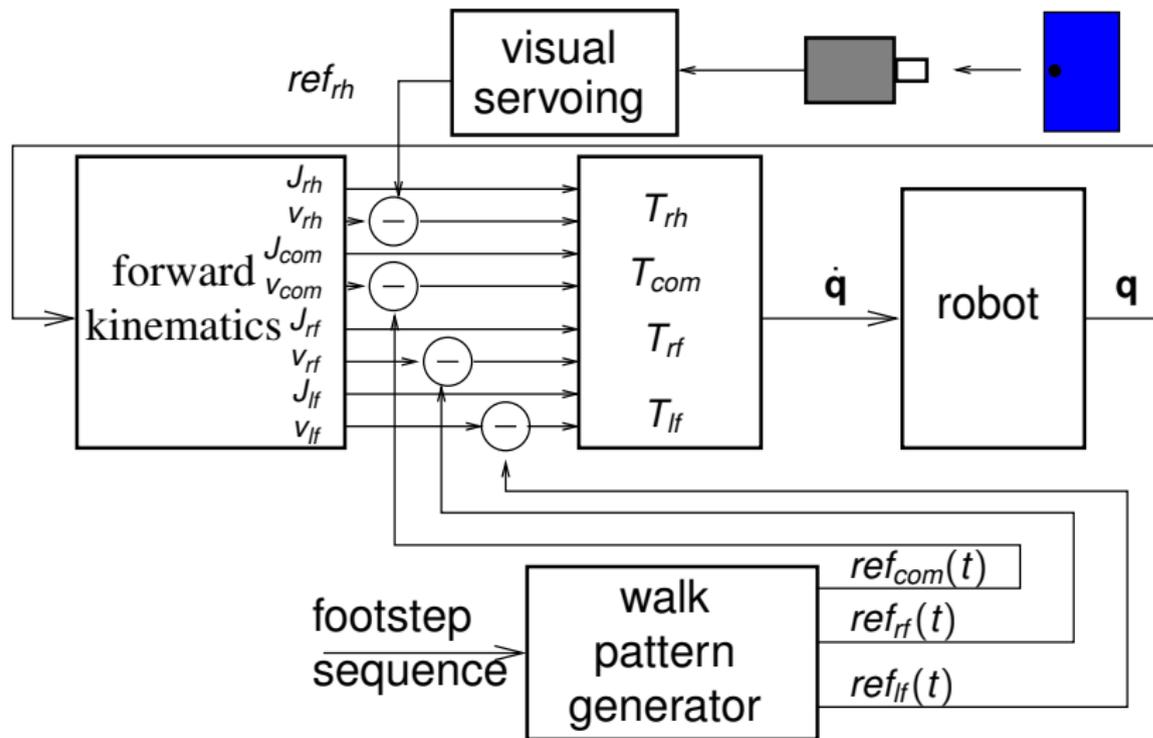
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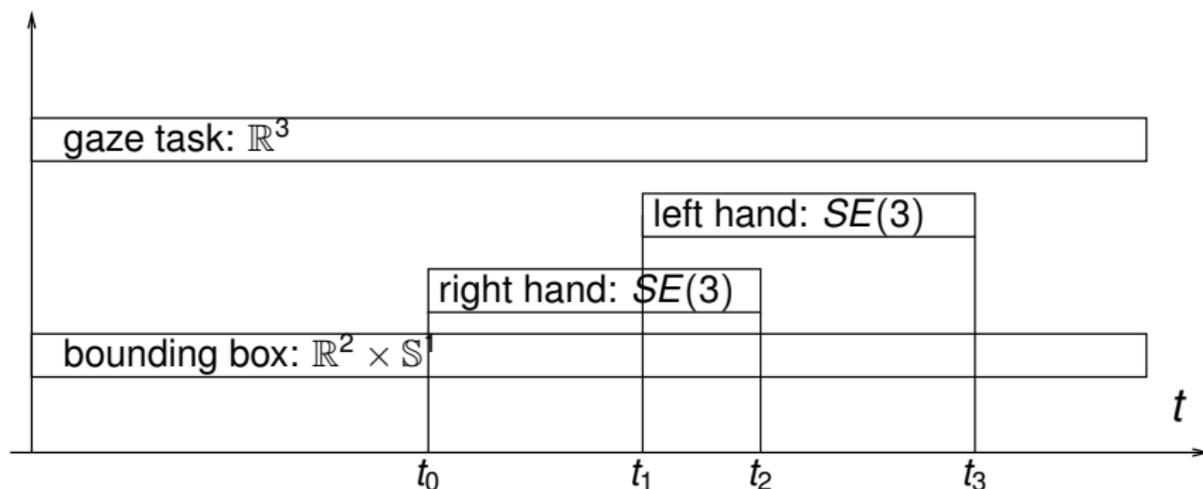
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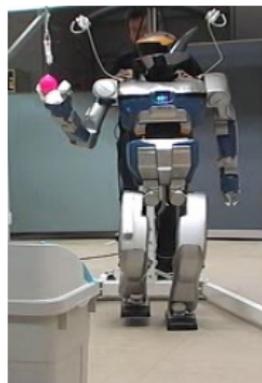
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# Motion plan



# Preview



- Grasping a ball while walking, N. Mansard, O. Stasse, JRL - Tsukuba 2007.

# Conclusion

- Let us do it on the physical robot