

Accurate trajectory tracking on the KUKA youBot manipulator: Computed-torque control and Friction compensation

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Motivation

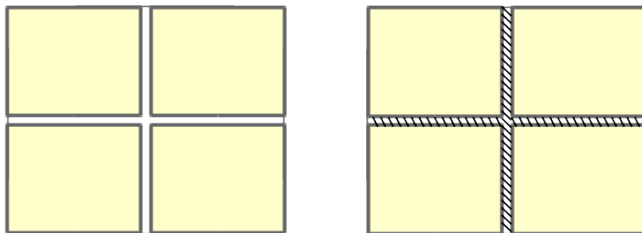


Figure 1 : Filling gaps between tiles

- Filling the gaps with waterproof liquid in between tiles
- Welding and surgical tasks also require high-precision tracking
- Don't damage environment and the robot

Related work

- Newton-Euler formulation has been used mostly in rigid-body algorithms [3] [4] [5] [8]
- In previous work [7], geometrical relation semantics were constructed in the numerical level and the parameter identification is incomplete
- Parameters identification methods based on the modified Newton-Euler formulation were proposed by [3] [6]
- The friction modeling and compensation brings us close to the complete dynamics [10] [11]
- Computed-torque control scheme has been proposed by many authors [2] [9] which discuss progress towards complete dynamics

Problem formulation

- Achieving accurate trajectory tracking in a non-linear system is difficult due to the following
 - Complexity of the dynamics
 - Uncertainties
- So, manipulator dynamics has to be considered in control scheme
- Construction of rigid-body algorithms has to consider the following
 - Geometric relations between rigid-bodies has to involve semantics checking in addition to numerical computations
 - Rigid-body algorithm's with this standard check avoids logical error, and perform meaningful operations
- Requirement of excitation trajectories for parameter identification

Approach

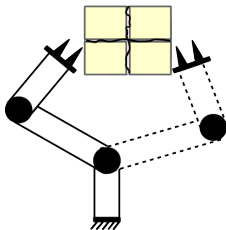


Figure 2 : Manipulation task

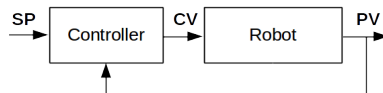


Figure 3 : Closed-loop system

- Problem: It could damage the environment and robot due to
 - system is non-linear
 - compromise on performance due to uncertainties

Approach

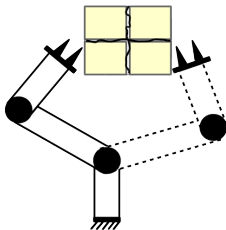


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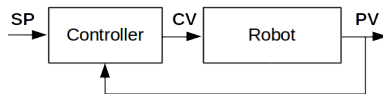


Figure 3 : Closed-loop system

- Problem: It could damage the environment and robot due to
 - system is non-linear
 - compromise on performance due to uncertainties
- Solution: Accounting manipulator dynamics and manipulator configuration

Basic and alternate approach

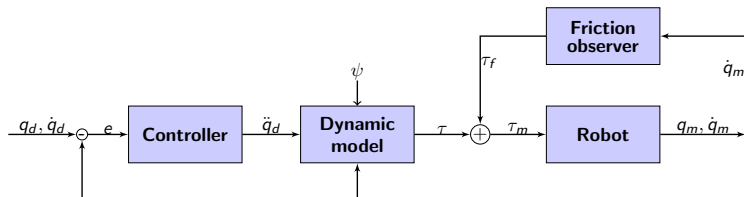


Figure 4 : Basic approach: inaccurate model parameters

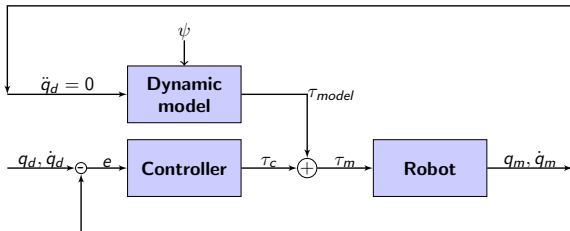


Figure 5 : Alternate approach with simple computed-torque control

Approach

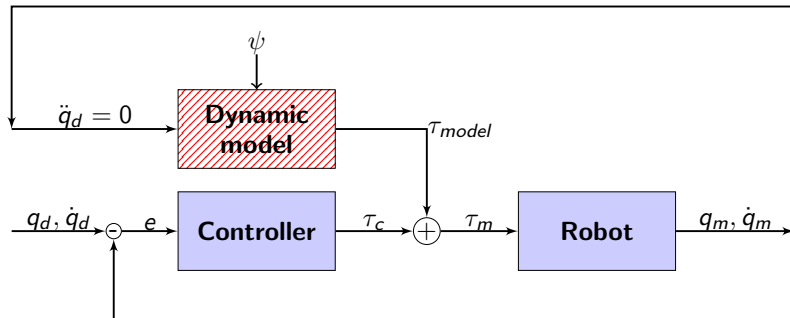


Figure 6 : Alternate approach

- Let's have a look into dynamic model of the robot manipulator

Dynamic model I

- The general equation of motion [2] can be given as

$$\tau_{model} = M(q, \psi) \overset{\text{Joiningpoint}}{\ddot{q}} + \underbrace{C(q, \dot{q}, \psi)\dot{q} + N(q, \dot{q}, \psi)}_{\text{non-linear}} \quad (1)$$

- where M , C and N are non-linear functions of ψ (model parameters)
- \ddot{q} can be replaced with linear controller i.e. PID [12]
- The non-linear terms C , N are handled by dynamic model which includes friction
- This work uses **Inverse Dynamics** solver from Orocos KDL [4]

Dynamic model II - findings

- Kinematic chain of youBot manipulator is constructed in KDL
- Dynamic model parameters ψ are taken from manufacturers [13] defined w.r.t. reference frame
- Center of mass and inertial frames are depicted w.r.t. reference frame

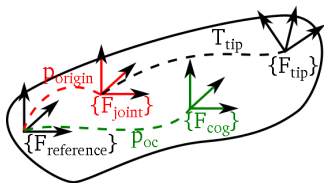


Figure 7 : Segment image [4]

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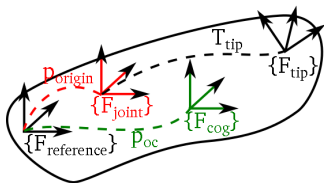


Figure 7 : Segment image [4]

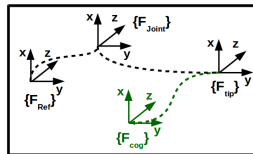


Figure 8 : Modified

- But implementation considers tip frame as reference
- Relations between rigid-bodies are defined implicitly

Dynamic model III

- In previous work [7], implementation was based on coordinate computations without semantics checkings
- Geometric relation semantics of rigid-body algorithms are analyzed
- It includes pose, motion and force related semantics
- Why is it important to include semantics checking?
 - Rigid body conventions differ from one author to another
 - To avoid logical errors in rigid body algorithm construction
 - i.e. Transforming twists between rigid bodies requires a common point and same coordinate frame

Dynamic model IV

Figure 9 : KDL segment

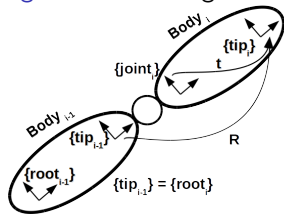
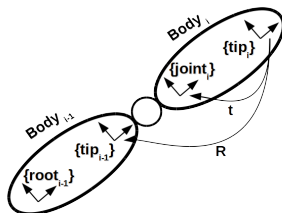
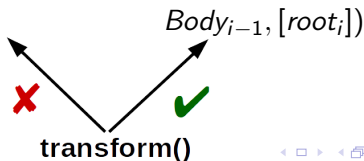


Figure 10 : Featherstone



- t : $\text{Position}(tip_i, joint_i)$
 R : $\text{Rotation}([tip_i], [root_i])$
- $V_J = \text{Twist}(joint_i | Body_i,$
 $Body_{i-1}, [root_i])$

- t : $\text{Position}(tip_i, joint_i)$
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Parameter identification - Excitation trajectories

- Trajectory parameterization and optimization is needed to get excitation trajectories [6]
- Finite Fourier series is used to get parameterized trajectories
- Optimizing an objective function $K^T K$ over the coefficients $a, b, q(0)$
 - where $q(0)$ represents initial position of the joint
 - a, b are the coefficients that covers the workspace of the joint
 - Constraints are q, \dot{q}, \ddot{q} within the joint limits and no collision constraint

Approach

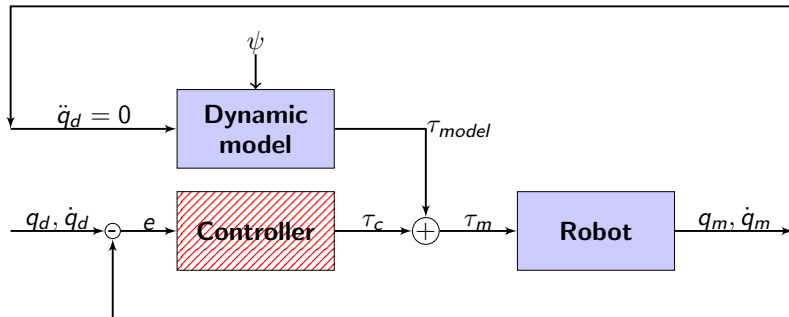


Figure 11 : Alternative approach

- Let's have a look into controller
- Computed-torque control runs at ≈ 1 KHz due to EtherCAT sampling constraint

Safety controller

- Safety of the hardware is the primary focus to save equipments
- Before commanding **torque** to manipulator joints, three different checks are performed
 - **Position** limit check based on measured joint positions
 - **Velocity** limit check based on measured joint velocities
 - **Torque** limit check based on measured joint torques
- If any of these check fails controller sets joint velocities to zero and quits
- Artificial joint limits are imposed and clamping

Cascade PI control I

- The outer-loop controller is position PI and inner-loop is velocity PI

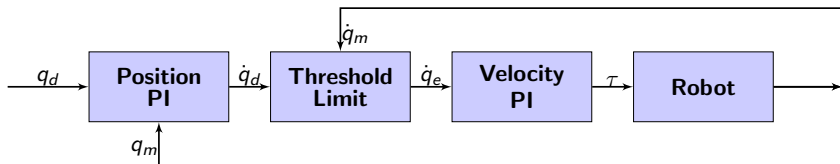


Figure 12 : Cascade PI controller

- Position controller output is fed as an input to velocity PI controller

$$\dot{q}_d = q_e \cdot K_p + \sum q_e \cdot K_i \quad (2)$$

- Control output of position PI is fed to inner-loop

Cascade PI control II

- Produces higher velocity if disturbances are not handled
- Limiting velocity of the joint

$$\dot{q}_e = \text{limit}(\dot{q}_d - \dot{q}_m) \quad (3)$$

- Cascaded PI control along with gravity compensation looks like

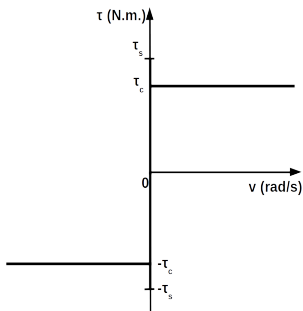
$$\tau = \overbrace{(\dot{q}_e \cdot K_p + \sum \dot{q}_e \cdot K_i)}^{\text{ControlVariable}} + \overbrace{\tau_g(q)}^{\text{Torqueduetogravity}} + \text{bias} \quad (4)$$

- The above equation specifies computed-torque control scheme

Friction observer

- Friction is a non-linear phenomenon that needs to be modeled and it can be classified into
 - Static friction is applied when joint is in equilibrium state
 - Coulomb friction is applied when joint is at motion

Figure 13 : Simple model of friction



Flow diagram and libraries used

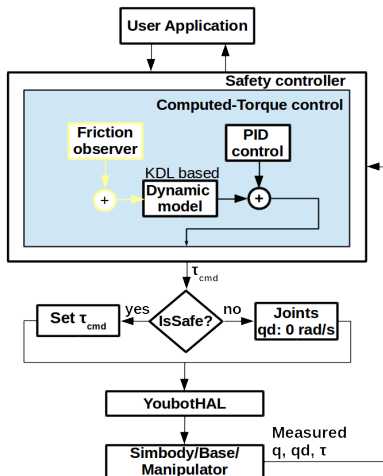
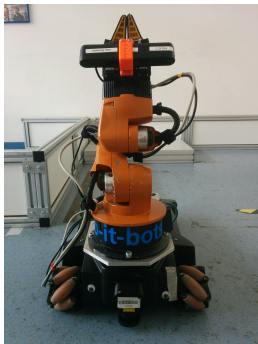


Figure 14 : Software flow

Experimentation



Experimentation steps

- Safety controller on base and arm
- Tuning controller gains
- Cascade PI control
- Gravity compensation
- Validation of model-based controller

Empirical tuning of controller gains

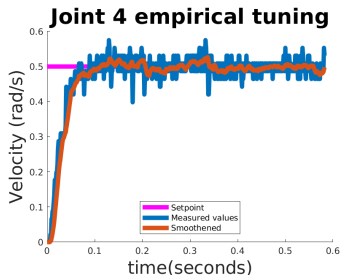


Figure 15 : Velocity PI tuning

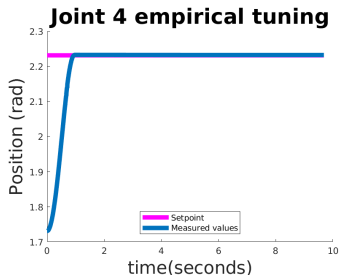


Figure 16 : Position PI tuning

- Inner-loop controller is tuned at first then outer-loop
- Increase P-gain till it reaches the set-point
- Gradually increase I-gain till steady-state error is close to zero

Validation of computed-torque controller

Joint 5 trajectory generation

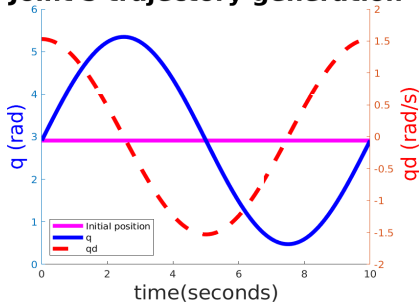
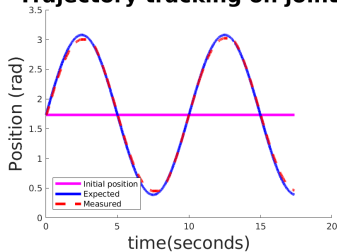


Figure 17 : Analytical trajectory

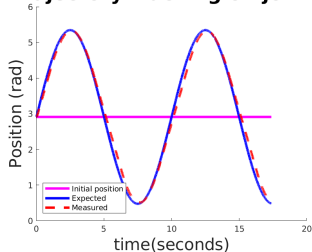
- Simple sine wave is selected
- It is simpler to derive the velocity from q
- Compute maximum and minimum velocity of joints
- To validate the model-based controller

Validation of computed-torque controller

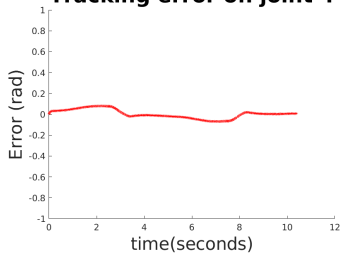
Trajectory tracking on joint 4



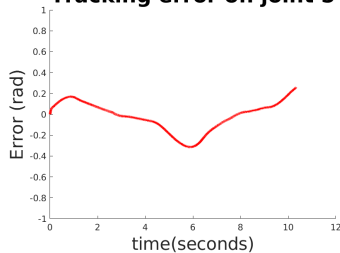
Trajectory tracking on joint 5



Tracking error on joint 4

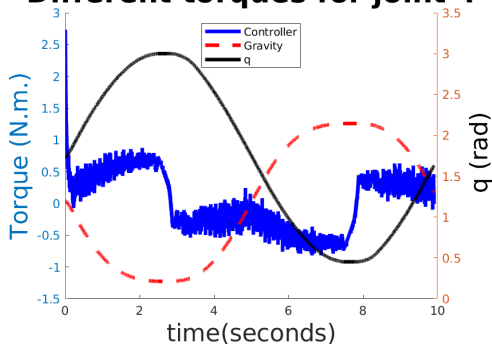


Tracking error on joint 5



Model and controller torques

Different torques for joint 4



- Model has no high-frequency noises in gravity torques
- Controller handles disturbances

Conclusions I

- Attempt to achieve complete dynamics which improves the performance of computed-torque control
- Kinematic chain of youBot manipulator is constructed manually
- The basic friction model that comprises static, Coulomb friction is implemented and compensation terms are added in dynamic model
- Safety controller ensures the safety of the robotic joint with an acceptable delay in response
- Empirical tuning of the controller gains

Conclusions II

- Controller is implemented on youBot base due to the semantic mismatches between Simbody and KDL
- Cascaded PI controller in youBot manipulator runs in approximately 1 KHz
- Gravity compensation is achieved with model-based controller
- Model-based control scheme is validated by using analytical trajectories
- In spite of inaccurate model parameters, the proposed control scheme produces accurate tracking with some deviations

Future work

- Geometric relation semantics correction and identification
- The basic approach can be used once accurate model parameters are identified
- Safety controller has to be adapted to check joint constraints actively than defining a static value
- Tuning controller gains based on auto-tuning procedures
- Inclusion of D-term increases stability
- Controller's performance can be improved in a hard real-time operating systems

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tree/master/youbot_arm_model](https://github.com/uzh-rpg/rpg_youbot_torque_control/tree/master/youbot_arm_model)* .
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Questions???

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