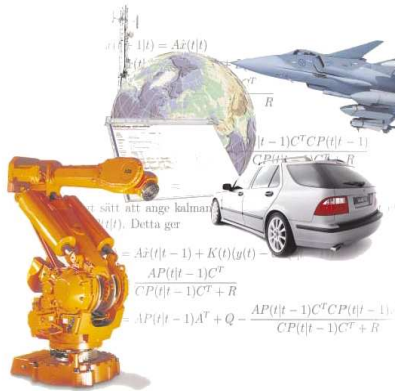


Towards improved performance for industrial robots



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Special thanks to:
 Mattias Björkman, Torgny Brogårdh,
 Svante Gunnarsson, Rickard Karlsson,
 Stig Moberg and Erik Wernholt

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The robotics activities within ISIS

- Iterative Learning Control
- Robot trajectory generation and optimization
- Robot modeling and identification
- Robot control
 - Joint level control
 - Multivariable control
 - Sensor fusion
- Robot diagnosis

Common factor for all the activities:

Increased robot performance!



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The robot system and its components

- Links
- Joints
- Motors
- Gears
- Bearings

Main problems:

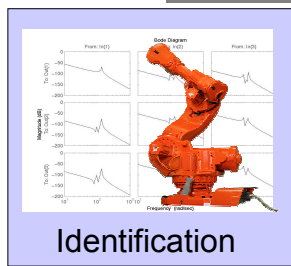
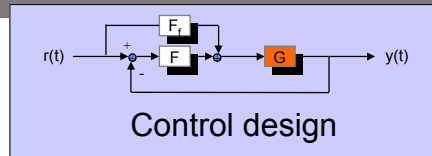
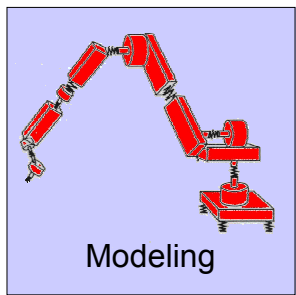
- Flexibilities
- Friction
- Sensor and actuator uncertainties



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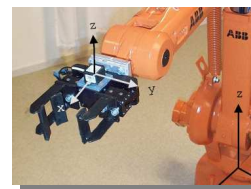


ISIS activities



Trajectory generation and optimization

$$\begin{aligned} \text{s.t.} \quad & 0 \leq u_i \leq u_{max} \\ & 0 \leq \dot{u}_i \leq \dot{u}_{max} \\ & \phi_{min,i} \leq \phi(u) \leq \phi_{max,i} \\ & \dot{\phi}_{min,i} \leq \dot{\phi}(u) \leq \dot{\phi}_{max,i} \end{aligned}$$

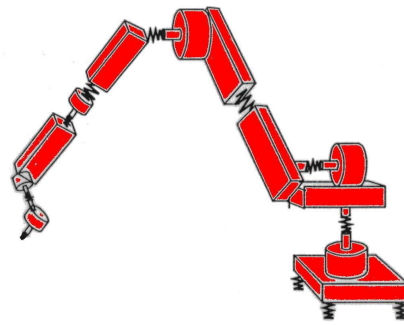
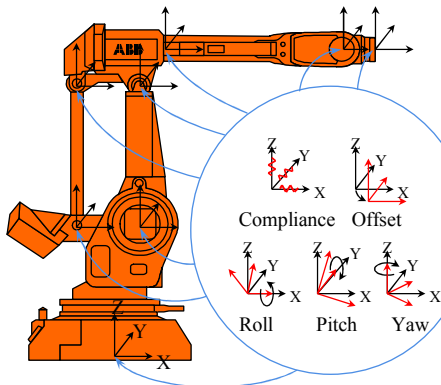


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Robot modeling

- Kinematics
- Elastostatic
- Rigid body dynamics
- Elastodynamic

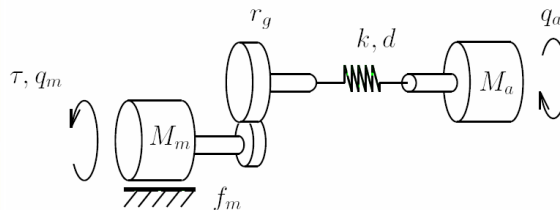
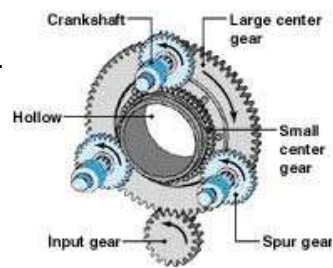
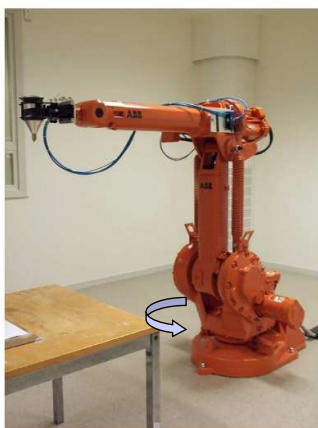


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Joint level modeling

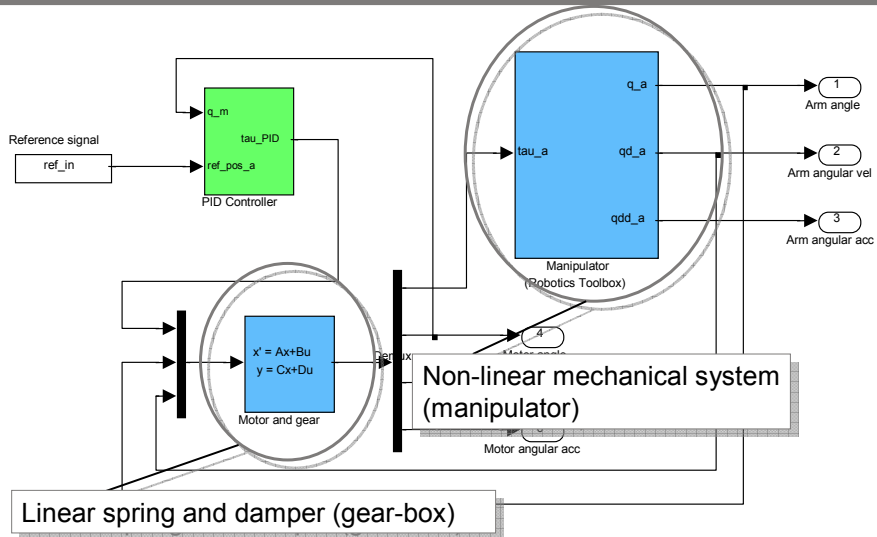
Linear system approximation.



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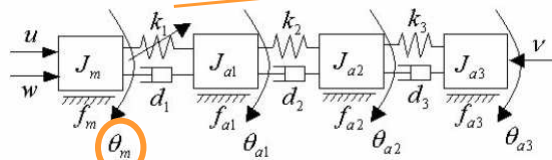
Robot modeling



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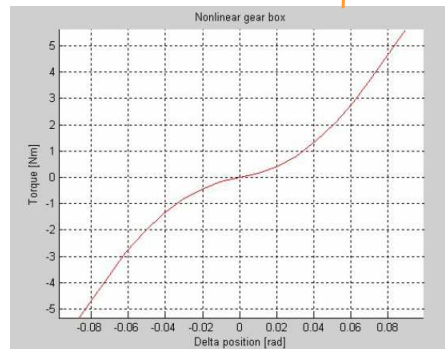


Non-linear joint model



Measured output

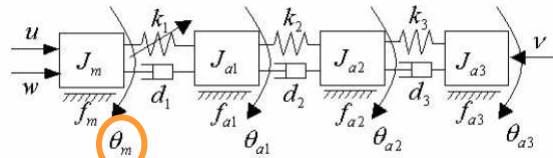
Non-linear stiffness



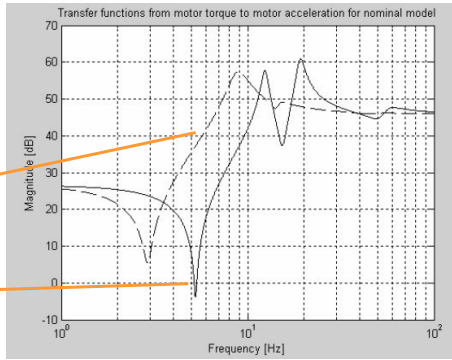
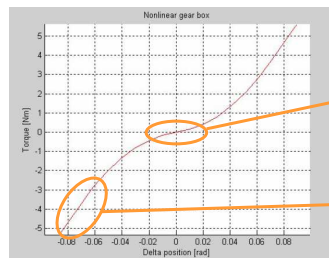
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Non-linear joint model



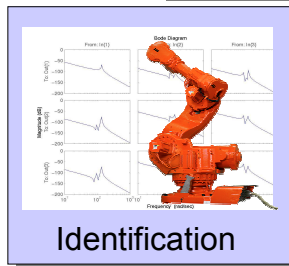
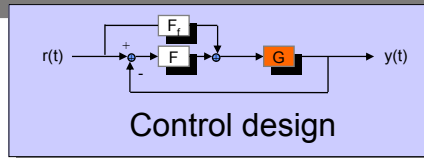
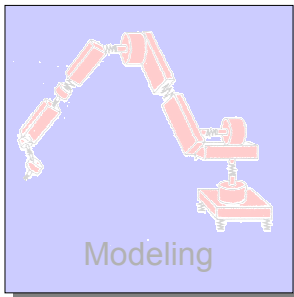
Measured output



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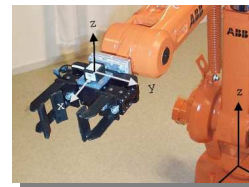


ISIS activities



Trajectory generation and optimization

$$\begin{aligned} \text{Minimize } & \alpha \\ \text{s.t. } & \alpha_{\min} \leq \alpha \leq \alpha_{\max} \\ & 0 \leq v_i(u) \leq v_{i,j} \\ & \phi_{\min,i} \leq \phi_i(u) \leq \phi_{\max,i} \\ & \psi_{\min,i} \leq \psi_i(u) \leq \psi_{\max,i} \end{aligned}$$

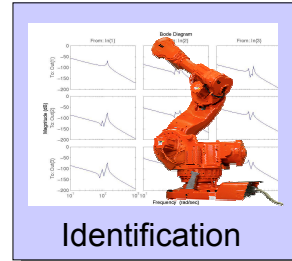


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Identification

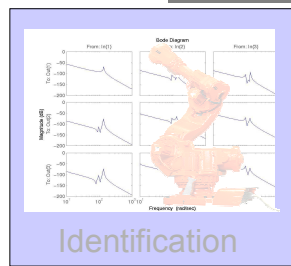
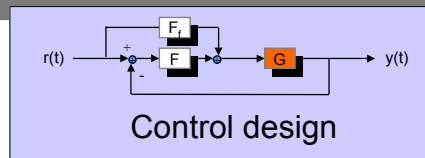
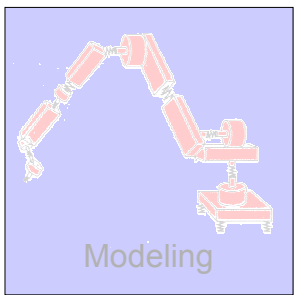
- Choice of excitation signal
- Measurements
- Stochastic disturbances
- Deterministic disturbances
- Transient and stationary behavior
- Non-linear system



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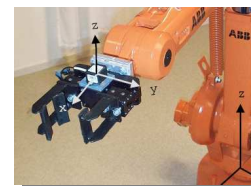


ISIS activities



Trajectory generation and optimization

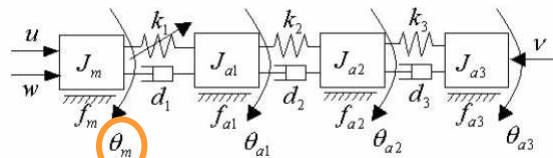
$$\begin{aligned} & \min_{\mathbf{u}} \int_0^T \mathbf{1}^T \mathbf{u} \, dt \\ \text{s.t.} \quad & \mathbf{u}_{\min} \leq \mathbf{u} \leq \mathbf{u}_{\max} \\ & 0 \leq \mathbf{v}(\mathbf{u}) \leq \mathbf{v}_d \\ & \dot{\phi}_{\min} \leq \dot{\phi}(\mathbf{u}) \leq \dot{\phi}_{\max} \\ & \ddot{\phi}_{\min} \leq \ddot{\phi}(\mathbf{u}) \leq \ddot{\phi}_{\max} \end{aligned}$$



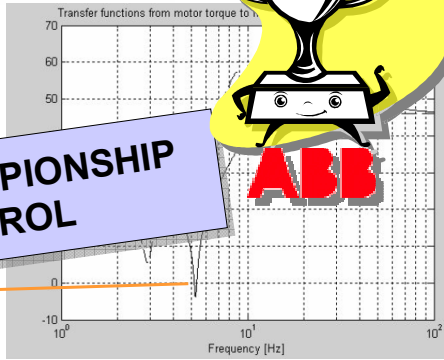
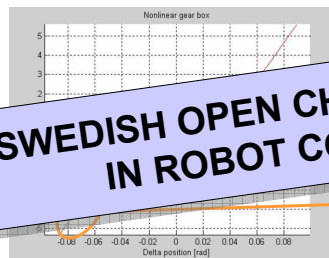
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Non-linear joint model



Measured output

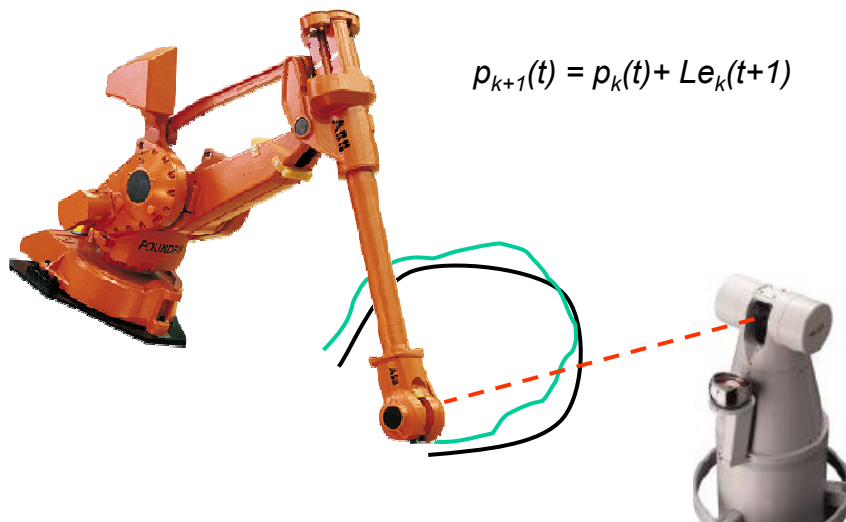


**SWEDISH OPEN CHAMPIONSHIP
IN ROBOT CONTROL**

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The iterative learning control technique

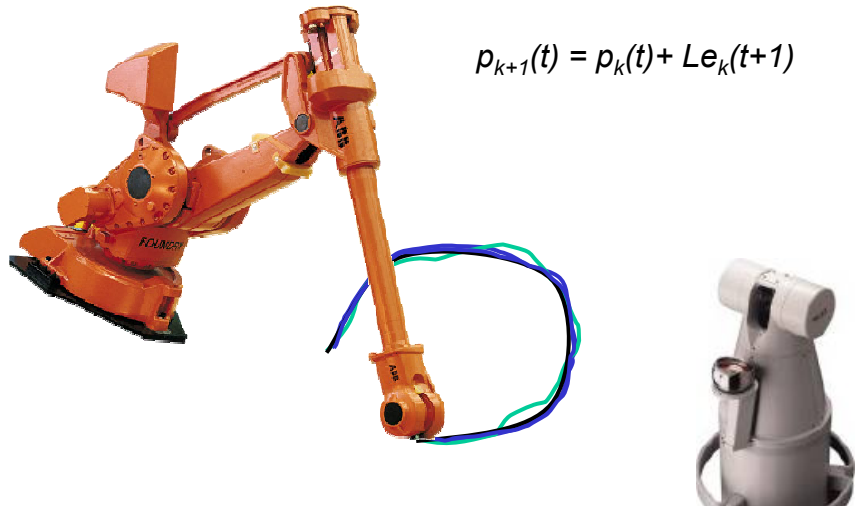


$$p_{k+1}(t) = p_k(t) + Le_k(t+1)$$

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The iterative learning control technique

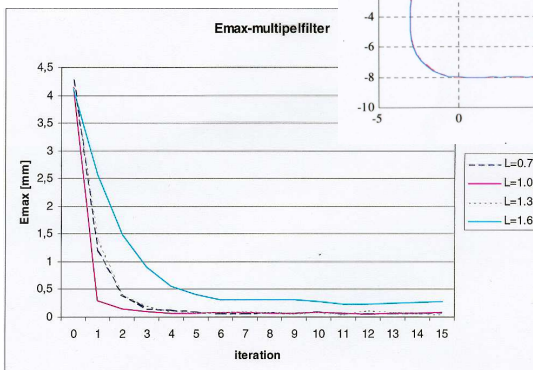
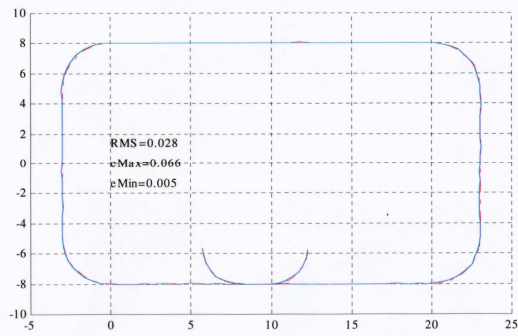
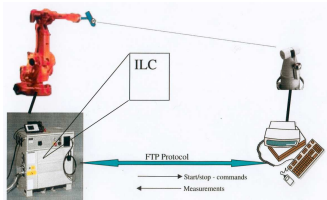


$$p_{k+1}(t) = p_k(t) + Le_k(t+1)$$

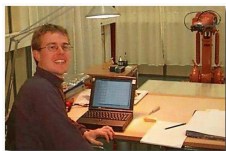
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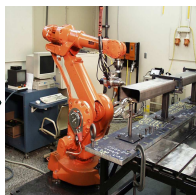
Iterative Learning Control



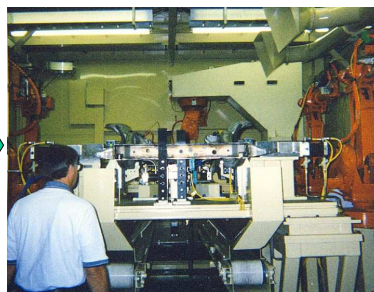
Iterative Learning Control



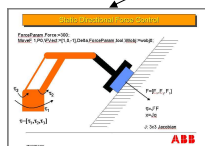
ISIS



DCT



Tower Automotive

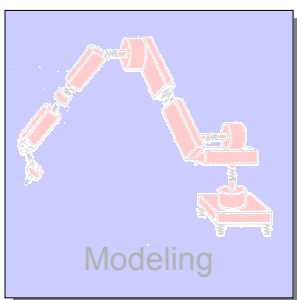


80 ABB robots

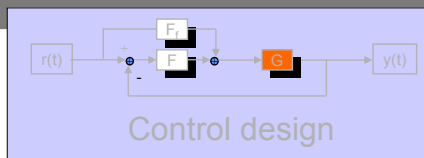


650 ABB robots

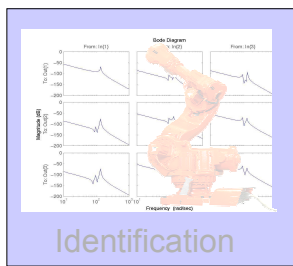
ISIS activities



Modeling



Control design



Identification

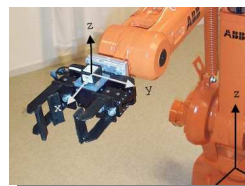
$$\min_{\alpha} \int_0^T \|\ddot{u}(t)\|^2 dt$$
 s.t.

$$0 \leq u(t) \leq u_{max}$$

$$\dot{\phi}_{min} \leq \dot{\phi}(t) \leq \dot{\phi}_{max}$$

$$\phi_{min} \leq \phi(t) \leq \phi_{max}$$

Trajectory generation and optimization



Sensor fusion

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Sensor fusion



The basic idea:

"Use measurements from a sensor mounted at the tool to get better estimates of the position, velocity, and acceleration."

Sensor fusion based on Bayesian techniques

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Using additional sensors

What can be achieved?

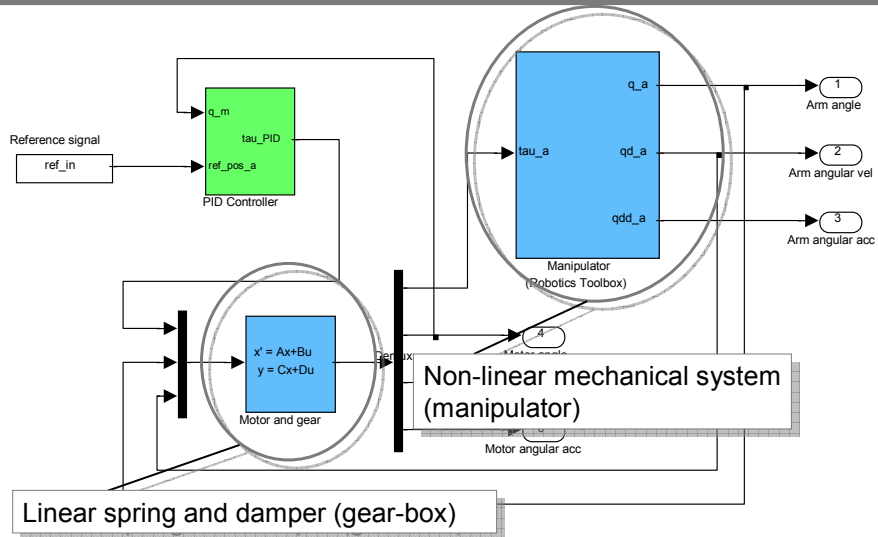
- Increased robustness
- Higher accuracy
- Increased stiffness



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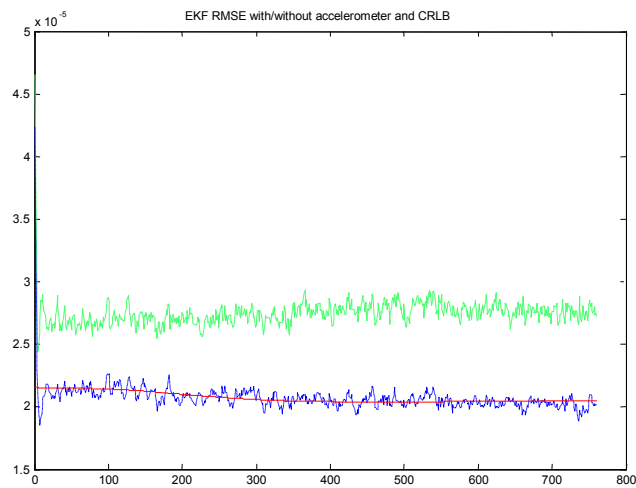
The "true" system



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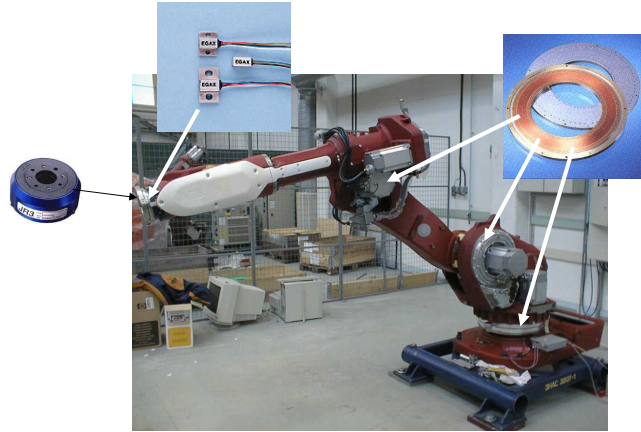
Evaluation of arm position estimation



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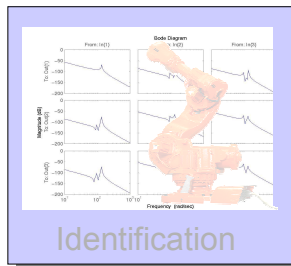
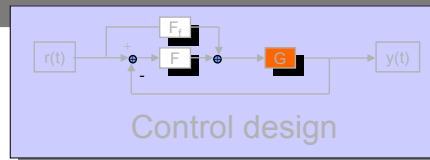
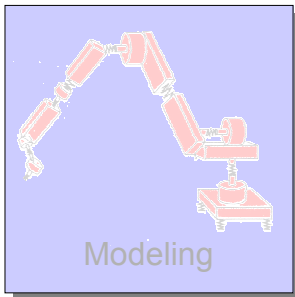
Other possible sensors



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ISIS activities



$$\min_{\alpha} \int_0^T \|\ddot{q}\|^2 dt$$

$$\text{s.t. } \alpha_{\min} \leq \alpha \leq \alpha_{\max}$$

$$0 \leq v_i(\alpha) \leq v_{i, \max}$$

$$\dot{\phi}_{\min} \leq \dot{\phi}(\alpha) \leq \dot{\phi}_{\max}$$

$$\ddot{\phi}_{\min} \leq \ddot{\phi}(\alpha) \leq \ddot{\phi}_{\max}$$

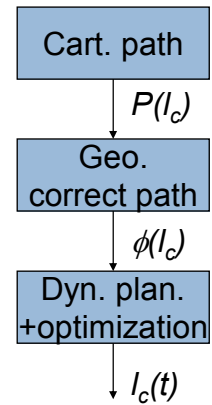
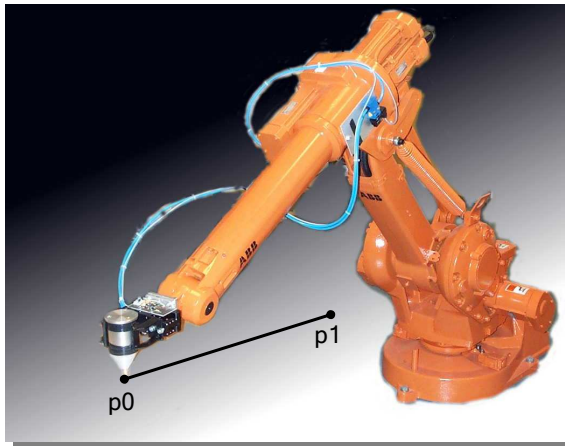
Trajectory generation and optimization



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The trajectory generation problem

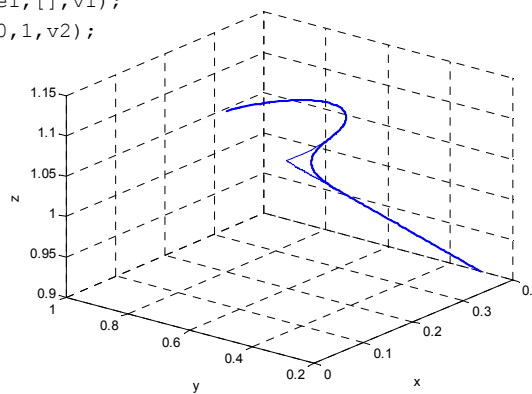


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Path generation Toolbox in Matlab

```
p1 = [0.4,0.3,0.9]; p2 = [0.1,0.45,1.1];  
p3 = [0.3,0.60,1.1]; p4 = [0.2,0.8,1.1];  
zone1 = 0.1; zonemethod = 1; v1 = 0.25; v2 = 0.25;  
esec = emptysec(p1);  
lsec = moveline(esec,p2,zone1,[],v1);  
csec = movecirc(lsec,p3,p4,0,1,v2);  
rpath = makepath(lsec,csec)
```

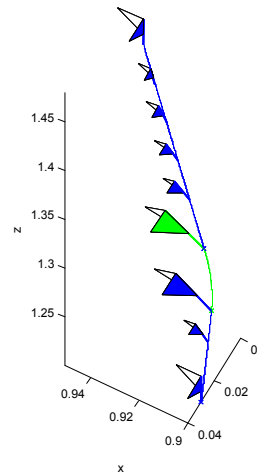


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Path generation Toolbox in Matlab

Orientation information will be added in PGT v0.3



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Dynamic optimization

- Path: $P(l_c), \phi(l_c)$
- Path speed and acceleration:

$$v = \left\| \frac{dP}{dl_c} \right\| \frac{dl_c}{dt}, \quad a_{path} = \left\| \frac{dP}{dl_c} \right\| \frac{d^2 l_c}{dt^2}$$

$$\dot{\phi} = \frac{d\phi}{dl_c} \frac{dl_c}{dt}, \quad \ddot{\phi} = \frac{d^2 \phi}{dl_c^2} \left(\frac{dl_c}{dt} \right)^2 + \frac{d\phi}{dl_c} \frac{d^2 l_c}{dt^2}$$

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Dynamic optimization

Let
$$l(t) = \frac{a(t - t_p)^2}{2} + v(t - t_p) + l_p, \quad t \in [t_p, t_n]$$

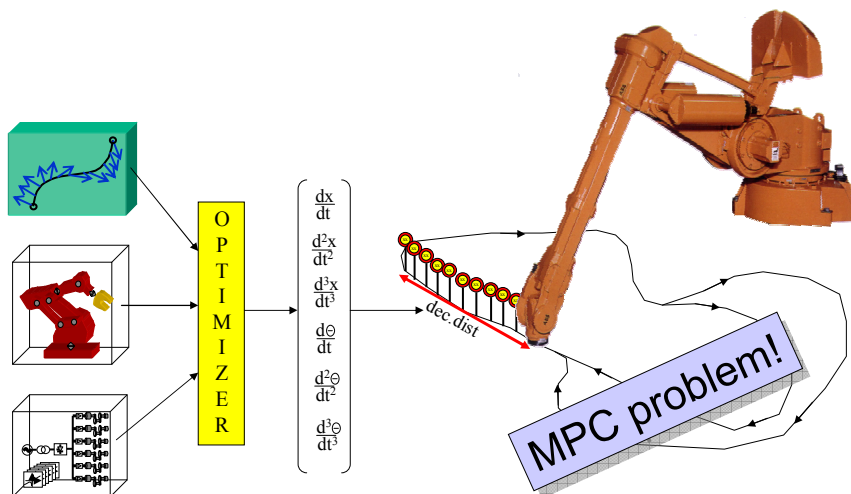
A (sub) optimal minimum time trajectory is found by solving the following LP problem

$$\begin{aligned} & \max_a a_1 \\ \text{s.t.} \quad & a_{min} \leq a \leq a_{max} \\ & 0 \leq v(a) \leq v_d \\ & \dot{\phi}_{min} \leq \dot{\phi}(a) \leq \dot{\phi}_{max} \\ & \ddot{\phi}_{min} \leq \ddot{\phi}(a) \leq \ddot{\phi}_{max} \end{aligned}$$

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Dynamic optimization



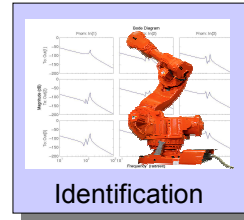
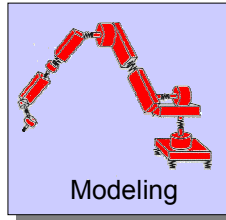
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Conclusions

Impact on current and future products

- Auto tune
- Control design



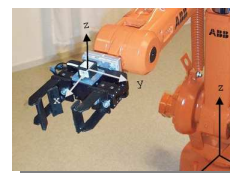
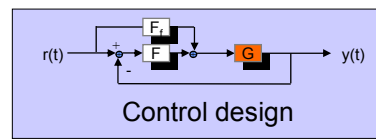
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Conclusions

Impact on current and future products

- Iterative Learning Control
- More flexible mechanical design



Sensor fusion

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Conclusions

Impact on current and future products

- Make better use of the robot performance
- Reduced price

$$\begin{aligned} & \max_{\alpha} \alpha_1 \\ \text{s.t.} \quad & \alpha_{\min} \leq \alpha \leq \alpha_{\max} \\ & 0 \leq v(\alpha) \leq v_2 \\ & \dot{\phi}_{\min} \leq \dot{\phi}(\alpha) \leq \dot{\phi}_{\max} \\ & \ddot{\phi}_{\min} \leq \ddot{\phi}(\alpha) \leq \ddot{\phi}_{\max} \end{aligned}$$
 Trajectory generation and optimization

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Conclusions



“ISIS has activities in areas central for the future developments in industrial robotics”

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