Controlling and Measuring Impedance in Variable Stiffness Robots

A.Bicchi*+

A. Ajoudani^{*+}, F. Belo^{*}, F. Bonomo^{*}, M. Catalano^{*+},
M. Gabiccini, M. Garabini^{*}, G. Grioli^{*}, M. Mancini^{*},
A. Passaglia^{*}, P. Salaris^{*}, P. Scilingo^{*}, G. Valenza^{*},

N. Tsagarakis⁺



*Centro "E. Piaggio", Università di Pisa +IIT - Istituto Italiano di Tecnologia

Outline

- A bit of a retrospective
- Using Variable Impedance
 - Optimal control
 - Safety oriented
 - Performance oriented
 - Energy oriented
 - Tele-Impedance
- Measuring Variable Impedance
- VSA and Hands
- Design

How to go beyond rigid robot limitations?





ISRR 2003

Variable Stiffness Actuators



Variable Stiffness Actuators



From Motors to Muscles for Robots



Robots vs. Humans What a difference a body makes!

VSA as "Muscles for Robots"

- What will future robots look like?
- From Position Control

To Torque Control

 to Equilibrium Point AND
 Impedance Control



Outline

- A bit of a retrospective
- Using Variable Impedance
 - Optimal control
 - Safety oriented
 - Performance oriented
 - Energy oriented
 - Tele-Impedance
- Measuring Variable Impedance
- VSA and Hands
- Design

Optimal Control of Variable Impedance Actuators

M. Garabini^{*}, F. Belo^{*}, G. Grioli^{*}, M. Mancini^{*}, A. Passaglia^{*}, P. Salaris^{*} A.Bicchi^{*+}

*Centro "E. Piaggio", Università di Pisa ^IIT - Istituto Italiano di Tecnologia





Safety-oriented Optimal Control

• Machines interacting with humans have different requirements than current in industry

Accuracy less demanding

✓ Safety is a must

An approach: Design for Accuracy, Control for Safety

Keep using rigid robots;

✓ Increase sensors drastically;

✓ Use active control;

Modern approach: Design for Safety, Control for Accuracy

✓ Mechanical (passive) compliance;

✓ Compensation by control;

Conventional Design



- First: minimize rotor + link inertia, use compliant covering if possible
- Given rotor + link inertia, covering, and acceptable risk \rightarrow max. velocity
- Position control only makes this worse



Conventional Design with Active Force Control - *Ideally*



as K_f increases.

Conventional Design with Active Force Control - *Really*



- 1) limited torque/link inertia ratio
- 2) limited mechanical bandwidth
- 3) limited sampling bandwidth



Ratio of Link Inertia vs. Max. Torque

Active force control ineffective in real conditions

Conventional Design with Active Force Control - *Really*



How to get beyond these limitations?



How to get beyond these limitations? - 2



Soft Robotics

Constant Passive Compliance

- Compliance is fixed
- Absorb impact effects
- •Adapt by changing the elastic element
- •Only one motor
- •Can be actively controlled to alter impedance

Variable Passive Compliance

- Compliance can be changed
- •Adapt to situations, e.g.:
 - position a heavy load
 - move a glass of liquid
- •Extra motor to alter impedance
- Increased complexity
- **SEA**

Series Elastic Actuators Variable Stiffness Actuators VSA

Slowly Variable Compliance

SEA

Soft Robotics

VSA

- Compliance can be changed once per task
- Adapt to nominally planned tasks
- Extra motor to alter compliance

Quickly Variable Compliance

• Compliance can be changed with time constants comparable to motion

- Adapt stiffness *during* tasks, e.g.:
- (Larger) extra motor to alter compliance







The Safe Brachistocrone for Series-Elastic Actuators



Linear system with linear inequality bounds

$$\min_{T} \int_{0}^{T} 1 dt M_{rot} \ddot{x}_{rot} + K_{transm} (x_{rot} - x_{link}) = u M_{link} \ddot{x}_{link} + K_{transm} (x_{link} - x_{rot}) = 0 |\dot{x}_{link}| \leq \beta HIC_{max}^{\frac{2}{5}}$$
 State & Control constraints
 |u| $\leq U_{max}$
 $(x_{link}, \dot{x}_{link})(0) = (X_{ini}, 0) $(x_{link}, \dot{x}_{link})(T) = (0, 0)$$

The Safe Brachistocrone for Series-Elastic Actuators

- For high transmission
 elasticity → slow response
 (oscillations, low accuracy,...);
- High transmission stiffness,
 high reflected inertia → low
 velocities for safety
- An optimum for transmission stiffness design exists
- Performance still limited



Recovering Performance by VSA



Safe Brachistochrone for VSA

Can the control of transmission compliance recover performance?



The Safe Brachistocrone is now nonlinear

$$\begin{array}{l} \min_{T} \int_{0}^{T} 1 dt \\ M_{rot} \ddot{x}_{rot} + u_{K} (x_{rot} - x_{link}) = u_{act} \\ M_{link} \ddot{x}_{link} + u_{K} (x_{link} - x_{rot}) = 0 \\ |\dot{x}_{link}| \leq \beta(u_{K}) HIC_{max}^{2} \\ |u_{act}| \leq U_{max} \\ u_{K,min} \leq u_{K} \leq u_{K,max} \\ (x_{link}, \dot{x}_{link})(0) = (X_{ini}, 0) \\ (x_{link}, \dot{x}_{link})(T) = (0, 0) \end{array}$$

Comparison of VSA, SEA and DM²

•VST performance recovery highest when transmission stiffness varies in broad range (ideally, 0 to ∞).



Simulation results for VSA (rotor & link)



Control Policy for VSA



The intuitive policy of synchronizing joint stiffness and joint velocity is indeed consistent with the optimal solution for the safe brachistochrone!

→ Fast & Soft, Stiff & Slow



How to Plan Variable Impedance

Optimal Control

. . .

- Safe Brachistochrone
 ("soft and fast, stiff and slow")
- Hit maximization (MaxSpeed problem)
- Motion on a limit cycle (Energy Efficiency)

Exploiting the Dynamics of VSA







Hammering



Index $J = \phi(x(T)) = x_2(T) = \dot{q}(T)$. Dynamics $\dot{x} = f(x, u)$, Initial conditions q(0) = 0

Terminal const. $\psi(x(T)) = x_1(T) = q(T) = 0$ Hamiltonian $H(x(t), \lambda(t), u(t)) = \lambda^T(t)f(x(t), u(t))$

Optimality in Stiffness Control: Single Stroke MaxSpeed Problem



A. Passaglia, M.S. Thesis, 2010 M. Garabini, A. Passaglia, F. Belo, P. Salaris, A.B., IROS2011



 $v_{max} = 2\sqrt{2}u_{max}\omega$ $v_{max} = 4u_{max}$ $v_{max} = 5.74\frac{u_{max}}{\omega}$

Single Stroke MaxSpeed Problem: Is There a Best Constant Stiffness?



Position control: the stiffer, the better Velocity control: *k*-invariant

Acceleration control: the softer, the better

Realistic Conditions (Acc.Ctrl. s.t. Pos., Speed constraints) $\rightarrow k^{opt}$ exists!

Experimental Results



MaxSpeed Problem: Can VSA improve further?



State	$ \begin{cases} x^T = \\ u^T = \end{cases} $	$\begin{bmatrix} q & \dot{q} \end{bmatrix}$ $\begin{bmatrix} \theta & k \end{bmatrix}$
space definition	$\begin{cases} \dot{x} = \end{cases}$	$\begin{bmatrix} x_2 \\ \frac{u_2}{m}(u_1 - x_1) \end{bmatrix}$

Hamiltonian	$H = \lambda_1 x_2 - \lambda_2 \frac{u_2}{m} (x_1 - u_1)$
-------------	---

Co-State dynamics $\begin{cases} \dot{\lambda}^T = \begin{bmatrix} \frac{u_2}{m} \lambda_2 & -\lambda_1 \end{bmatrix} \\ \lambda (T)^T = \begin{bmatrix} 0 & 1 \end{bmatrix}$

Optimal control law

$$u_{1}^{*} = \begin{cases} u_{1,max} \text{ if } \lambda_{2} > 0\\ -u_{1,max} \text{ if } \lambda_{2} < 0 \end{cases}$$
$$u_{2}^{*} = \begin{cases} u_{2,max} \text{ if } \lambda_{2} (u_{1} - x_{1}) > 0\\ u_{2,min} \text{ if } \lambda_{2} (u_{1} - x_{1}) < 0 \end{cases}$$

Analytical solution available! (IROS 2011)

Main Results (IROS 2011)

Theorem 1: The optimal control is characterized by the following properties:

1) the switching sequence is

$$\{S_2; S_{1,2}; S_2; \dots; S_2; S_{1,2}\},$$
(14)

2) the time between S_2 and $S_{1,2}$ is

$$t_{S_{1,2}} = \sqrt{m/k_{min}}\pi/2,$$
 (15)

3) the time between $S_{1,2}$ and S_2 , the time of the first period and the time of the last period are:

$$t_{S_2} = \sqrt{m/k_{max}}\pi/2\,,\tag{16}$$

MultiStroke MaxSpeed Problem




optimal (max) K

Main Results (IROS 2011)

Theorem 1: The optimal control is characterized by the following properties:

1) the switching sequence is

$$\{S_2; S_{1,2}; S_2; \dots; S_2; S_{1,2}\},$$
(14)

2) the time between S_2 and $S_{1,2}$ is

$$t_{S_{1,2}} = \sqrt{m/k_{min}}\pi/2,$$
 (15)

3) the time between $S_{1,2}$ and S_2 , the time of the first period and the time of the last period are:

$$t_{S_2} = \sqrt{m/k_{max}}\pi/2\,,\tag{16}$$

Theorem 2: The stiffness optimal control is: $u_2 = \begin{cases} u_{2,\max} & \text{if } \dot{q}\ddot{q} > 0 \\ u_{2,\min} & \text{if } \dot{q}\ddot{q} < 0 \end{cases}$

→ Stiff speed-up, soft slow-down

VSA Optimal control



Single Stroke MaxSpeed Problem: Experimental





Variable

Optimization of Cyclic Movements

Embodying Desired Behavior in Variable Stiffness Actuators*

Ludo C. Visser^{*} Stefano Stramigioli^{*} Antonio Bicchi^{**}

- Mechanical compliance introduces intrinsic, passive oscillatory behavior: you can fight this, or exploit it
- Concept of nonlinear resonant modes
- VSA can be controlled such that its passive behavior is as close as possible to the desired behavior and the control effort is minimized.
- The cost criterion provides a measure of embodiment of the desired behavior in the passive behavior of the variable stiffness actuator





Outline

- A bit of a retrospective
- Using Variable Impedance
 - Optimal control
 - Safety oriented
 - Performance oriented
 - Energy oriented

– Tele-Impedance

- Measuring Variable Impedance
- VSA and Hands
- Design

How to Plan Variable Impedance

- How do humans use variable impedance?
 - study human subjects
 - Arm stiffness is adapted to tasks and force fields [Kawato, Hogan, Burdet, Gomi, Franklin, Shadmer, ...]
 - Results look at impedance in one configuration after several learning trials
 - How do humans vary their stiffness while throwing, drumming, walking ?



How to Plan Variable Impedance

- Let the human do it
 - Not general
 - Makes sense in applications where you need to replicate some skills at a distance
 - \rightarrow Teleoperation of Impedance

Teleoperation

- Teleoperation consists of measuring motor control parameters in human, and replicating in robots
- Remote position control is rather easy used to be done with exoskeletons as "master" and robot arms as "slave"
- Position control is not enough because of interaction with unknown remote environments



Teleimpedance

- Remote control with force feedback
 - needs force sensors on the robot
 - may have stability problems because of transmission delays in the control loop
- Can we instead do remote impedance control?
 - use human arm position and impedance as references for robot
 - use local controllers (no delays, very stable) to make the robot track those plans

Teleimpedance

 The operator moves the hand and adapts his/her arm impedance to solve the task based on visual information from the scene

Three questions:

- How do we sense position and impedance on the master?
- How do we control them on the slave?
- Is this useful to solve the task?

EMG

- Electromyographic signals correspond to muscle activation, hence are strongly correlated with muscle force
- Very easy to implant, not invasive, relatively cheap (compared to force-reflecting exoskeletons)
- The command signal of choice for prostheses
- Signals are noisy and not too stable good processing needed

EMG and Robotics

- Sophisticated signal processing techniques should be applied for precise continuous estimation of the movement of the human limbs, because of
 - cross-talk between channels of surface EMGs
 - correlation between EMGs and isometric muscle tension and impedance
 - Typical EMG processing is by segments, introducing latency which affects negatively realtime control of a robot

EMG and Robotics

- A significant amount of research in applications of EMGs in Robotics, exoskeletons and prosthetic devices
- Few among many notable contributions:
 - B. E. Mustard and R. G. Lee (1987);
 - Castellini and van der Smagt (2008-2009);
 - Bu, Okamoto, and Tsuji (2009);
 - Artemiadis and Kyriakopoulos (2010),

EMG and Stiffness

- Surface EMGs are highly correlated with static stiffness (Osu and Gomi 1999)
- EMGs are widely considered as the best candidate source for stiffness estimation of the human joints (Darainy et al 2004; Flash and Mussa Ivaldi 1990; Franklin et al 2003; Mussa Ivaldi et al 1985; Geribble et al 2003; Osu and Gomi 1999; Tsuji et al 1995 and Shin et al 2008)
- Few applications to robotics

EMG and Stiffness

Previous work on joint torque and stiffness estimation from EMG signals demonstrated feasibility, and indicated methods

"Estimation of MultiJoint Limb Stiffness from EMG Duirng Reaching Movements", D.W. Franklin, F. Leung, M. Kawato, T. E. Milner 2003

"Multijoint Muscle Regulation Mechanisms Examined by Measured Human Arm Stiffness and EMG Signals" R. Osu and H. Gomi, J. Neurophysiol., 2005





EMG and Stiffness

- Muscle tensions correspond to the rectified EMGs of the arm muscles (Basnajian and De Luca 1984)
- The relationship between EMGs of agonistic and antagonistic muscles to the generated torques and stiffness in joints can be assumed linear in isometric conditions (Osu, Gomi Kawato *et al.* 2001). Neglecting cross-joint stiffness w.r.t. homologous joint stiffness (Gomi and Osu 1998) →

$$\tau = T(q)f, \quad \tau, q \in \mathbb{R}^3, f \in \mathbb{R}^6$$
$$\sigma = S(q)f, \quad \sigma = \left(\frac{\partial \tau_i}{\partial q_i}\right) \in \mathbb{R}^3$$

EMG and Position Control

- EMG related to muscle force not to displacement indeed, a person can relax muscles at arbitrary positions (Wachholder)
- How to control slave position from master force information?
 - Control the robot force (with dynamic scaling)
 - Integrate the human arm dynamics to find position
 - Forget it
 - There exist very cheap and accurate endpoint position sensors





 $, u_b$

Decoupled Position and Impedance Remote Control

- Control is decoupled so that the error-prone EMG impedance measurements will not spoil the accurate position tracking control
- True only as far as there are no external forces: if there are, the control of stiffness will have implications on the position tracking error (by definition)

Decoupled Position/Stiffness Control of Robot Arms



 $T^+ = T^T (T T^T)^{-1}$

DPIRC Control Scheme



Experimental Setup



- Kuka LW Arm
- FR interface (Schreiber *et al* 2011)
- Advanced end-point Impedance
 Controller

•3D Optitrack motion capture

system



Stiffness from EMG

$$S_{s} = \sum_{i=1}^{n} \alpha_{i} \cdot f(EMG_{ago-i}) - \sum_{j=1}^{n} \beta_{j} \cdot f(EMG_{anta-j})$$
$$S_{e} = \sum_{i=1}^{n} \delta_{i} \cdot f(EMG_{ago-i}) - \sum_{j=1}^{n} \mu_{j} \cdot f(EMG_{anta-j})$$

s:shoulder e:elbow

fEMG: filtered EMG

 α, β, δ and μ : constant coefficients to be estimated

Calibration Experiments



Instrumented Handle with Spherical Joint



Electrode Placement

Isometric conditions 50 trials Subjective stiffness Coefficients calculated based on Osu and Gomi (1999) , Osu, Gomi and Kawato et all (2001)).



Experiments



Disturbances

Interaction with soft, sticky surface <u>Position and Stiffness</u> <u>Control</u> <u>Sponge</u> Assembly Task <u>Position Control,</u> <u>Constant Low Stiffness</u>

> Position Control, Constant High Stiffness

Teleimpedance Control (1) Teleimpedance Control (2)

<u>Me</u>

Outline

- A bit of a retrospective
- Using Variable Impedance
 - Optimal control
 - Safety oriented
 - Performance oriented
 - Energy oriented
 - Tele-Impedance
- Measuring Variable Impedance
- VSA and Hands
- Design

Measuring Variable Impedance

Giorgio Grioli^{*}, Alessandro Serio⁺, Nikos Tsagarakis⁺ Irene Sardellitti⁺ Antonio Bicchi^{*+}

*Centro "E. Piaggio", Università di Pisa ^IIT - Istituto Italiano di Tecnologia



Impedance for Non-Linear Mechanical Systems

• Simplest notion of mechanical impedance: Linear stiffness (Hooke's Law) $f = Ky \xrightarrow{f} \vdash WWV \xrightarrow{f}$

Y

m

Y

- Generalization to Non-Linear Springs:
 - Partial derivative $y = f(y) \implies \sigma(y) = \frac{\partial f(y)}{\partial y}$

 $f = m\ddot{y} + b\dot{y} ky$

•

- Generalization to **Dynamic Systems**:
 - Laplace Transform: Impedance

$$F(s) = (ms^2y + bs + k)Y(s) = Z(s)Y(s)$$

i.e., an *operator* that sends functions (and initial conditions) in functions 28/07/2011

Impedance for Non-Linear Mechanical Systems

• Generalizing Impedance:

- Graph $G \subset F \times Y \times DY \times D^2Y \times U$

• Analytical Description $G(f, y, \dot{y}, \ddot{y}, u) = 0$



– At a Regular point d_0 :

Locally there exists an implicit function

$$k(d) = -\left(\frac{\partial G(d)}{\partial f}\right)^{-1} \frac{\partial G(d)}{\partial y}$$
$$b(d) = -\left(\frac{\partial G(d)}{\partial f}\right)^{-1} \frac{\partial G(d)}{\partial \dot{y}}$$
$$m(d) = -\left(\frac{\partial G(d)}{\partial f}\right)^{-1} \frac{\partial G(d)}{\partial \ddot{y}}$$

Fréchet differential

• $f(y, \dot{y}, \ddot{y}, u)$

 $\delta f = m(d) \, \delta \ddot{y} + b(d) \, \delta \dot{y} + k(d) \, \delta y + \nu(d) \, \delta u$

Admittance View

$$\begin{aligned} \ddot{y} &= g(y, \dot{y}, f, u) \\ \frac{d}{dt} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = \begin{bmatrix} x_2 \\ g(x_1, x_2, f, u) \end{bmatrix} \\ \dot{\tilde{x}} &= \Gamma(t)\tilde{x} + \Theta(t)\tilde{f}, \end{aligned}$$

where

$$\Gamma(t) = \left[\begin{array}{cc} 0 & 1 \\ -\frac{k(d)}{m(d)} & -\frac{b(d)}{m(d)} \end{array} \right], \quad \Theta(t) = \left[\begin{array}{c} 0 \\ \frac{1}{m(d)} \end{array} \right].$$

An example

Antagonist "muscle" system
 – Dynamics:

$$I\ddot{\theta} + \beta\dot{\theta}|\dot{\theta}| - \tau_b + \tau_t - mgl\sin\theta - \tau_e = 0$$

where

 $\tau_b = -\alpha(\theta_b - u_b)^2$ $\tau_t = -\alpha(\theta_t - u_t)^2$

- Gen. Stiffness: $k(\theta) = 2\alpha(\pi - u_b - u_t) - mgl\cos(\theta)$

 u_t (

 $, u_b$

– Gen. Damping: $b(\dot{\theta}) = 2\beta |\dot{\theta}|$

An example



Fig. 4. Generalized stiffness (left - dashed is without gravity term) and generalized damping for the example with acuators as in (4), subject to a unit step in external torque at T = 1s, and with time-varying reference angle $\lambda_b(t) = \lambda_t(t)$ linearly decreasing from $\pi/3$ at T = 1s to 0 at T = 15s. Numerical values used in simulation as in fig. 3, except for $\alpha = 0.3$.

Measuring Impedance

 Measurements are at the basis of science *"Misura ciò che e misurabile, e rendi misurabile ciò che non lo è" (Measure what is measurable, and make measurable what is not)*

- Feedback needs measuring
 - Measuring impedance is needed for control of VIA actuators
- Impedance is a differential operator not a *physical quantity* in a strict sense

"Physical Quantity: a property of a phenomenon, body, or substance, where the property has a magnitude that can be expressed as a number and a reference"

> International Vocabulary of Metrology (VIM). Basic and General Concepts and Associated Terms.

Galileo

Measuring Impedance

Impedance Measurements State of the Art

- In ME
- In Biomechanics
- In Robotics, etc.

Common Characteristics

- Typically: repeated experiments with probing perturbations
- Mostly: not applicable in real time
- Always*: linear, time invariant impedance

Measuring Linear Impedance

- Simple case $f = m\ddot{y} + b\dot{y} + ky$ m, b, k > 0
 - Build a non-linear equivalent system
 - Observability **Co-distribution**

Measuring Linear Impedance

$$f = m\ddot{y} + b\dot{y} + ky$$

Build a regression, or non-linear observer e.g. an Extended Kalman Filter



Measuring Nonlinear Impedance

$$f = m(\ddot{y}) + b(\dot{y}) + k(y)$$

The same approach is no longer possible (at least, not trivially)

$$\dot{z} = \begin{bmatrix} z_2 \\ z_1 z_3 + z_2 z_4 \\ ? \\ ? \\ ? \\ ? \\ ? \\ \end{pmatrix} + \begin{bmatrix} 0 \\ z_5 \\ ? \\ ? \\ ? \\ ? \\ ? \\ ? \\ \end{bmatrix} f$$
$$y = h(z) = z_1$$
Measuring Nonlinear Impedance

Using EKF with a nonlinear impedance...



28/07/2011

Variable Stiffness Observers



28/07/2011

The Variable Stiffness Observer



converges to within an Uniformly Ultimately Bounded error region around the real stiffness value

$$\left|\tilde{\sigma}\right| > \frac{\left|\sigma_{y}\right|}{\alpha} + \left(\left|f_{u}\right| + \frac{\left|\sigma_{u}\right|}{\alpha}\right)\frac{\dot{u}}{\dot{y}}$$
28/07/2011

"A Non-Invasive, Real-Time Method for Measuring Variable Stiffness" G. Grioli, A. Bicchi

> Robotic Science and Systems 2010, Zaragoza, Spain. Submitted paper



•The steeper stiffness changes with position and input, the larger is the error

•Large co-contraction velocity with slow limb displacement may cause large errors

VSO - Simulations



28/07/2011

More interesting Simulations

- When the limb stops...

– Errors in *m*,*b*





•The steeper stiffness changes with position and input, the larger is the error

•Large co-contraction velocity with slow limb displacement may cause large errors

Experimental Results





28/07/2011

Spring Calibration

Experimental Results

(a) positions u. u, Position [cm] Displacement [cm] 0. Time [s] -0 (b) forces -1.5L Force [N] Z 40 -50 Time [s] - Marker and **Position and Force** Time [s] 28/07/2011 Raw data

Experimental Results



Relative Error

Error

25% threshold (~ model SME)

20

25

VSO – Mass and Damping

Can we observe stiffness without knowing

τ

m,b

(่ง.น

- e.g. human measurements

YES if we measure the elastic force ("inside" the joint)

- e.g. robots

m and b?

Non-parametric Stiffness observer Evolutions:

> • Parametric Stiffness observer (ICRA2011)

• Decoupled Impedance Observer (ICRA2011)

Parametric Stiffness observer

Fills in the non-observable gaps (if internal measurements are available) (a) stiffness tracking



Parametric Stiffness observer

Fills in the non-observable gaps (if internal measurements are available) (a) stiffness tracking



DEV

LINK INERTIA

LINK DAMPING

INK STIFFNESS

Decoupled Impedance observer

-Idea:

Integrate stiffness observer with EKF for linear impedance

Exploit clever placement of torque sensor to avoid interaction of estimation dynamics

-Cons:

Not applicable to all kind of VSAs

Requires some knowledge of the motor model

-Pros:

Reconstructs the whole impedance on the link side

Decoupled Impedance observer -Reconstructs the whole impedance (K,D,I) Successfully applied to AwAS joint in Genoa





Decoupled Impedance observer

-Reconstructs the whole impedance (K,D,I)

Successfully applied to AwAS joint in Genoa



Summary - VSO

- A discussion of nonlinear impedance definitions
- Real-time, non-invasive algorithms to estimate stiffness
- Use of "dirty" derivatives increases error, do not pose threats to filter stability
- Can be easily replaced by torque error, even integrated (residuals see e.g. De Luca *et al.* 2011)
- Open issues

$$\dot{\tilde{\tau}} = \dot{\tau} - \dot{\hat{\tau}} = [...] = \tilde{\sigma}\dot{y}$$

- Extend to *n-dof's*
- Observe (nl, tv) generalized mass and damping
- Control impedance in closed loop
- Apply beyond robotics

Outline

- A bit of a retrospective
- Using Variable Impedance
 - Optimal control
 - Safety oriented
 - Performance oriented
 - Energy oriented
 - Tele-Impedance
- Measuring Variable Impedance
- VSA and Hands
- Design

The Redundancy Problem: Synergies in the Hand Motor System

 Extensive neuroscientific evidence for the existence of sensorimotor synergies and constraints

Babinski (1914!), Bernstein, Bizzi, Arbib, Jeannerod, Wolpert, Flanagan, Soechting, Sperry, ...

 Quantitative work on hand postural synergies dates back a decade only

Postural Synergies

 Santello et al. (1998) investigated the hypothesis that "learning to select appropriate grasps is applied to a series of inner representations of th complexity, which varies with experience and degree of accuracy required."



Santello, Flanders, Soechting J. Neuroscience, 1998

- 5 subjects were asked to shape their hands in order to mime grasps for a large set (57) of familiar objects;
- Joint values were recorded with a CyberGlove;
- Principal Components Analysis (PCA) of these data revealed that the first two Principal Components or postural synergies account ~.84%
 of the varia~.90% first three ;
- PCs (eigenvectors S_i of the Covariance Matrix) can be used to define a basis for a subspace of the joint space.

The Shape of Synergies

Postural *synergies* (aka **primitives**, *eigengrasps* or *principal grasp components*) are the eigenvectors of the joint data covariance matrix;

First synergies contain most of hand posture information; Higher-order synergies used for fine adjustments







Straightforward Kinematic interpretation:

Joint configurations must belong to s-dimensional manifold

$$\mathbf{q} = \mathbf{q}(\sigma), \ \sigma \in \mathbb{R}^s$$

- Hand velocities belong to tangent bundle $\dot{\mathbf{q}} = \mathbf{S}(\mathbf{q})\dot{\sigma}, \ \mathbf{S}(\cdot) \in {\rm I\!R}^{n imes s}$
- Fingers move according to Hand jacobian
 $\dot{\mathbf{c}}_f = \mathbf{J}\dot{\mathbf{q}} = \mathbf{JS}\dot{\sigma}$

From Pre-Grasp to Grasp

• First synergy only







• Stop on contact



[Brown and Asada, IROS2007]







• Stop and reshape the synergy (Ciocarlie *et al., 2007*)



• Not for force distribution analysis/control

Grasp Force Distribution

 Key point in grasping is how forces are applied and controlled

• Geometric synergy model can not account for grasping force generation

• What relation is there between grasping forces, grasping postures, and synergies?

Force Distribution: Notation and Equations

- External load (wrench) w
 Grasp matrix G (fat)
 Contact forces p
- Friction Constraints
- lacksquare Given ${f w}$ which ${f p}$?

$$\mathbf{w} = \mathbf{G}\mathbf{p},$$

$$\sigma_{i,f}(\mathbf{p}_i) = \alpha_i \|\mathbf{p}_i\| - \mathbf{p}_i^T \mathbf{n}_i < 0$$

$$\mathbf{p} = \mathbf{G}^R \mathbf{w} + \mathbf{A} \mathbf{x},$$

- \square \mathbf{G}^{R} (any) right inverse of \mathbf{G}
- \square A : a basis of the subspace of internal (squeezing) forces
- By changing x, squeezing forces are changed: if for every w it is possible to find x such that friction constraints are verified, than one has FcC
- This only holds for fingertip grasping with a large number of synergies!

Grasping with Synergies

- Hand joint torques τ Hand Jacobian J
- Hand with synergies

$$\tau = \mathbf{J}^T \mathbf{p},$$

$$\tau_{\sigma} = \mathbf{S}^T \mathbf{J}^T \mathbf{p}$$

$$\mathbf{S}^T \mathbf{J}^T \in {\rm I\!R}^{s \times p}$$

□Not invertible in general \rightarrow can not apply arbitrary contact forces p!

Grasping with Synergies



5 contact points

15 components of (frictional) contact forces

10 joints

1 synergy...



Grasping Forces & Synergies



Q: What internal forces at equilibrium are modifiable at will in a given grasp?

$$\mathbf{w} = \mathbf{G}\mathbf{p},$$
$$\tau_{\sigma} = \mathbf{S}^T \mathbf{J}^T \mathbf{p}$$

The rigid-body model of grasp is statically indeterminate – no way to determine \mathbf{p} for given \mathbf{w} and τ !

Must introduce congruence and constitutive equations – i.e. compliance

$$\begin{aligned} \dot{\mathbf{c}}_o &= \mathbf{G}^T \dot{\mathbf{u}} \\ \dot{\mathbf{c}}_f &= \mathbf{J}\mathbf{S} \ \dot{\sigma} \\ \mathbf{p} &= \mathbf{K} \left(\mathbf{c}_f - \mathbf{c}_o \right) \end{aligned}$$

Synergies and Hand Compliance

The stiffness matrix of a hand takes into account both structural compliance at the contacts, C_s , and joint-level compliance, C_a fingerpad object h-th tendon object joint compliance contact $k_2^{(q)}$ compliance τ_2 q_{r_2} j-th tendon equilibrium point τ_1 q_{r_1} l-th tendon (q) $\{P\}$ q_1 **Overall stiffness matrix** finger $\mathbf{K} = (\mathbf{C}_s + \mathbf{J}\mathbf{C}_q\mathbf{J}^T)^{-1}$

Internal Forces in Grasping with Synergies

- Internal Forces: $\mathbf{p} \in \ker(\mathbf{G})$
- Not all internal forces are independently controllable acting through the joints
- TH: The set of contact forces which can be actively controlled is a linear subspace of $\,ker({\bf G})$

$$\Box \qquad \mathbf{A}\mathbf{x} = \mathbf{K}\mathbf{J}\mathbf{S}\Delta\sigma - \mathbf{K}\mathbf{G}^{T}\Delta\mathbf{u}$$

$$PLV \rightarrow \begin{bmatrix} \mathbf{A} & -\mathbf{K}\mathbf{J}\mathbf{S} & \mathbf{K}\mathbf{G}^{T} \end{bmatrix} \begin{pmatrix} \mathbf{x} \\ \Delta\sigma \\ \Delta\mathbf{u} \end{pmatrix} = 0.$$
hence

$$\mathbf{p}_a = (\mathbf{I} - \mathbf{G}_K^R \mathbf{G}) \mathbf{K} \mathbf{J} \mathbf{S} \Delta \sigma$$

$$\mathbf{p}_a = \mathbf{E}_\sigma \mathbf{y}$$

The Soft Synergy Paradigm

- The posture (kinetic) synergy model only rules an internal "reference" representation of the hand configuration
- The higher level control of the hand commands this internal representation within the synergy manifold
- The actuator system of the hand is controlled towards this reference hand set-point
- The hand fingers and palm interact with manipulated objects and environment through contact
- The physical hand reaches an equilibrium under the effect of
 - attraction towards the synergy-driven reference hand
 - repulsion by contact forces
 - stiffness of actuators, tendons, and deformable bodies

Internal Forces in Grasping with Synergies

- Internal Forces: $\mathbf{p} \in \ker(\mathbf{G})$
- Not all internal forces are active (controllable) acting on the joints
- TH: The set of contact forces which can be actively controlled is a linear subspace of $\,ker({\bf G})$

 $\mathbf{p}_a = (\mathbf{I} - \mathbf{G}_K^R \mathbf{G}) \mathbf{K} \mathbf{J} \mathbf{S} \Delta \sigma \mathbf{K}$

$$\Box \qquad \mathbf{A}\mathbf{x} = \mathbf{K}\mathbf{J}\mathbf{S}\Delta\sigma - \mathbf{K}\mathbf{G}^{T}\Delta\mathbf{u}$$

$$\mathsf{PLV} \rightarrow \begin{bmatrix} \mathbf{A} & -\mathbf{K}\mathbf{J}\mathbf{S} & \mathbf{K}\mathbf{G}^{T} \end{bmatrix} \begin{pmatrix} \mathbf{x} \\ \Delta\sigma \\ \Delta\mathbf{u} \end{pmatrix} = 0.$$
hence

 $\mathbf{p}_a = \mathbf{E}_{\sigma} \mathbf{y}$

Visualizing Soft Synergies

Rigid Synergy = Reference Hand



Soft Synergy = Equilibrium Hand


Pinch Grasping with 3 soft Synergies







Power Grasping with 3 soft Synergies

• Ashtray





Questions

The first few synergies of the human hand explain much of covariance of grasp approach.

Are these also dominating in grasping forces?
(no experimental data so far)

Study of grasping forces depends on hand compliance.

• How robust are the results?

Precision grasp

- Variation of grasp quality measure with # synergies engaged in grasp
- Dimension of Internal Force subspace: 3
- Grasp is already force-closure using the 1-st synergy only
- Negligible effect of contact stiffness variation



Control experiment

• Randomized the order of synergies:

Synergies Engaged	Force closure	Grasp Quality
7	NO	-
7,4	NO	-
7,4,12	NO	-
7,4,12,5	NO	-
7,4,12,5,8	NO	-
7,4,12,5,8,1	ОК	1.37
7,4,12,5,8,1,4	ОК	1.37
7,4,12,5,8,1,4,2	ОК	1.34

Power grasp

- Variation of grasp quality measure with # synergies engaged in grasp
- Dimension of Internal Force subspace: 27
- Grasp is not always force-closure with the 1-st synergy only

Limited effect of contact stiffness variation



Summary

- Analytical Results
 - Translating synergies form kinematic to force domain (soft-synergies).
 - Solve the force decomposition and optimization problem for hands with synergies;
- "Experimental" Results
 - force-closure properties of grasps strongly depends on which synergies are used to control the hand;
 - if the first few synergies (PCs) are not actively controlled, force-closure can be obtained only by many more DoFs;
 - quality of grasp (different norms of contact forces to prevent slippage) is enhanced by increasing the actuated synergies, but only to a limited extent;
 - no improvement beyond the first three synergies for precision grasp, continuous but small improvements in the whole-hand grasp case;
 - results are consistently robust with respect to different values of the stiffness parameters (uncertainty in their knowledge/control).

Outline

- A bit of a retrospective
- Using Variable Impedance
 - Optimal control
 - Safety oriented
 - Performance oriented
 - Energy oriented
 - Tele-Impedance
- Measuring Variable Impedance
- VSA and Hands
- Design

Variable Stiffness Actuators – Pisa Soft Arm: 2000 VSA I: 2003 **QBots: TODAY** VSA II: 2008 VSA HD: 2010

VSA CUBE modular <u>servo</u> variable stiffness actuator



/esterday



today



embedded position and stiffness control

embedded

position control





Datasheet Template

Actuator Name		Actuator Name (repetition)		Α		ne (repetition)
Fig.1 Fig.2 Picture drawings	Fig.2 echanical interface drawings		Fig.8	l Actua	Fig.10a Itor Internals Layout	Fig.10b Actuator Internals Working Principle
Operating Data # (quarthy) (unit) (value) Mechanical M xxx Fig.3 1 Continuus Oddet Power M/ xxx 2 Nominal Torquer [Nm] xxx		vs Deflection		101 Recoil Poi Function	Mathemat	ical model $x_e = x_e (q_1, q_2)$
3 Nominal Speed (radio) xxx 4 Nominal Stiffmens with no load (r) xxx 5 Watch Time with no load (r) xxx 6 Peak (Maximum) Torque (N) xxx 7 Maximum Speed (radio) xxx 8 Maximum Strate (radio) xxx		Additional sensors data (quantity) (unit) (value)		102 Energy Function	I	$H = H\left(q_{1}, q_{2}, x\right)$
0 Minimum Stiffness Newtrad] xxx 10 Maximum Easts: Energy [J] xxx 11 Maximum Hysteress [] xxx 12 Maximum deflection [] xxx 13 Maximum deflection [] xxx		ad Sensor a at Resolution ()yy) xxx a2 Range ()yy) xxx a3 UO protocol ()yy) xxx ax (specific sensor properties) ()yy) xxx	Fig.9 Sensor Map	Output 103 Torque Function	2	$\tau = \tau (q_1, q_2, x)$
14 Active Relation Argle [1] xxx Speed 15 Argular Resolution [1] xxx Speed 16 Might [6] xxx Vs Electrical 17 Noment Voltage [6] xxx Torque		bx (specific senso properties) (byy) xxx by (specific sensor properties) (byy) xxx bz (specific sensor properties) (byy) xxx n0 Sensor n	reference in the second	Output 104 Stiffness Function	c	$\sigma = \sigma (q_1, q_2, x)$
10 Notice Poil Xxx 10 Maximum Current (A) xxx Control 20 Voltage Suppy (V) xxx 21 Nominal Current (A) xxx		This space is left blank for a	pace is left blank for any integrative information	Spring 105 Torque Function	е	$e_{S}=e_{S}(q_{1}, q_{2}, x)$
Fig.6 VS	Fig.5 Deflection	at the compiler's discretion. Examples may include: – additional system images – max. structural load values – accessories – software details		106 Springs to Motors Transmissi Ratio	n 2	$A = A(q_1, q_2, x)$
diagram Torque				Springs to Output Transmissi Ratio	on d	$B=B(q_1, q_2, x)$

Standard VS template A result of a combined effort by UNIPI, DLR and IIT Developed inside the VIACTORS project



mechanical data



	Operating Data					
	#	(quantity)	(unit)	(value)		
	Mechanical					
	1	Continuous Output Power	[W]	3.3		
0	Stiffness – Torque (for different Stiffness Preset)					
Electrical						
	17	Nominal Voltage	[1]	7.4		
1	18	Nominal Current	[A]	2		
1	19	Maximum Current	[A]	6		
Control						
100	20	Voltage Supply	[\]	5		
	21	Nominal Current	[A]	0.2		
	22	I/O protocol	۵	I ² C		
0 0.2 0.4 0.6 0.8 1 τ [Nm]						
	13	with min. sumess	[]	10.0		
	14	14 Active Rotation Angle		120		
	15	Angular Resolution	[°]	0.175		
	16	Weight	[Kg]	0.260		















Cubebot datasheet





Sensor Map

POSITION

Туре а

MOTOR

TWO

OUTPUT

POS.

Type b

		s data	Additional sensors	
MOTOR	(value)	(unit)	(quantity)	T
ONE		Sensor a		
	0,175	[7]	Resolution	
	0 - 270	[*]	Range	
	Analog	0	I/O protocol	
	5	[V]	Voltage Supply	
POSITIO		Sensor b		
SENSU	0,175	["]	Resolution	
Type a	0 - 360	["]	Range	
	Analog	0	I/O protocol	
	5	[V]	Voltage Supply	

54

Me	chanical Connecti	Structural Load	
Revolute Joint Parallel Axis	Revolute Joint Perpendicular Axis	Rigid Connection	RA.
			Fx,Fy=85 N Fz=85 N
	• • I		





mechanics



experimental tests











The Qbot

he

robotics

Qboid

Variable Stiffness Servo Motor

- □ Variable output shaft stiffness
- Embedded position and stiffness regulation
- Bus communication interface
- □ Modular actuation and building unit
- Low cost, Open-Source, Available

THANKS!