## Grasping

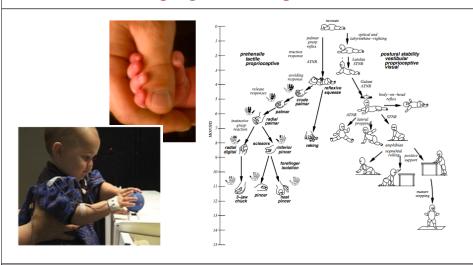
- MASS CHUSETT
  - mobility and connectivity analysis
  - form closure
  - the grasp Jacobian
  - force closure

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1

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### Grasping and Manipulation

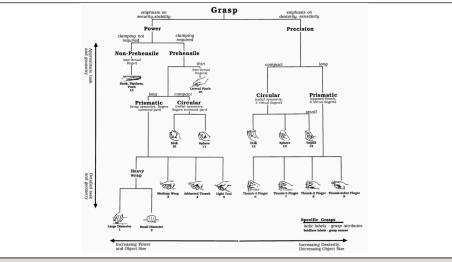


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### Grasping and Manipulation



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### Screw Nomenclature: Wrenches and Twists

twist: generalized velocity

$$\mathbf{v} = egin{bmatrix} v_x \ v_y \ v_z \ \omega_x \ \omega_y \end{bmatrix}$$

$$egin{aligned} & \underline{power}. & \mathbf{w}^T\mathbf{v} = [f_x \;\; f_y \;\; f_z \;\; m_x \;\; m_y \;\; m_z] & egin{aligned} v_y \ v_z \ \omega_x \ \omega_y \end{aligned}$$

wrench: generalized force

$$\mathbf{w} = egin{bmatrix} f_x \ f_y \ f_z \ m_x \ m_y \ m_z \ \end{pmatrix}$$

v and w do not constitute linear vector spaces!

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### Grasp Analysis - Mobility and Connectivity



 $\mathbf{v} \in V$ : object twists consistent with contact constraints; and  $\overline{\mathbf{v}} \in \overline{V}$ : object twists that are restricted by contact constraints.

$$span\{V \cup \overline{V}\} = \mathbb{R}^6 \quad and \quad \{V \cap \overline{V}\} = \{\emptyset\}$$

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### Grasp Analysis - Mobility and Connectivity



for a system of n contacts to immobilize a body:

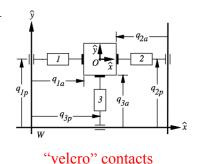
$$\{\mathbf{v}_1 \cap \mathbf{v}_2 \cap \cdots \cap \mathbf{v}_n\} = \{\emptyset\}, \text{ and }$$

$$span\{\overline{\mathbf{v}}_1 \cup \overline{\mathbf{v}}_2 \cup \cdots \cup \overline{\mathbf{v}}_n\} = \mathbb{R}^6$$

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#### Grasp Analysis - Mobility and Connectivity



finger #1: 
$$\begin{bmatrix} v_x \\ v_y \end{bmatrix}_O = \begin{bmatrix} 1 \\ 0 \end{bmatrix}_O \dot{q}_{1a} + \begin{bmatrix} 0 \\ 1 \end{bmatrix}_O \dot{q}_{1p}$$

$$= \overline{\mathbf{v}}_1 \quad \dot{q}_{1a} + \mathbf{v}_1 \quad \dot{q}_{1p}$$

finger #2: 
$$\begin{bmatrix} v_x \\ v_y \end{bmatrix}_{Q} = \begin{bmatrix} -1 \\ 0 \end{bmatrix}_{Q} \dot{q}_{2a} + \begin{bmatrix} 0 \\ 1 \end{bmatrix}_{Q} \dot{q}_{2p}$$

$$= \overline{\mathbf{v}}_2 \qquad \dot{q}_{2a} + \mathbf{v}_2 \qquad \dot{q}_{2b}$$

finger #3: 
$$\begin{bmatrix} v_x \\ v_y \end{bmatrix}_0 = \begin{bmatrix} 0 \\ 1 \end{bmatrix}_0 \dot{q}_{3a} + \begin{bmatrix} 1 \\ 0 \end{bmatrix}_0 \dot{q}_{3p}$$

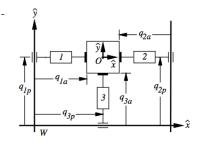
imagine that active dof can move to a position and then "lock" in place

$$= \overline{\mathbf{v}}_3 \quad \dot{q}_{3a} + \mathbf{v}_3 \quad \dot{q}_3$$

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#### Grasp Analysis - Mobility and Connectivity



$$\textit{finger #1:} \qquad \left[\begin{array}{c} v_x \\ v_y \end{array}\right]_O = \left[\begin{array}{c} 1 \\ 0 \end{array}\right]_O \dot{q}_{1a} + \left[\begin{array}{c} 0 \\ 1 \end{array}\right]_O \dot{q}_{1p}$$

$$= \quad \overline{\mathbf{v}}_1 \qquad \dot{q}_{1a} + \quad \mathbf{v}_1 \qquad \dot{q}_{1p}.$$

finger #2: 
$$\begin{bmatrix} v_x \\ v_y \end{bmatrix}_Q = \begin{bmatrix} -1 \\ 0 \end{bmatrix}_Q \dot{q}_{2a} + \begin{bmatrix} 0 \\ 1 \end{bmatrix}_Q \dot{q}_{2p}$$

$$\bar{\mathbf{v}}_2 \quad \dot{q}_{2a} + \mathbf{v}_2 \quad \dot{q}_{2p},$$

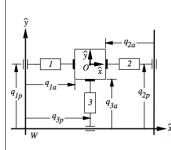
considering just fingers 1 and 2...

$$V = \bigcap_{i=1}^{2} \mathbf{v}_{i} = \begin{bmatrix} 0 \\ 1 \end{bmatrix} \bigcap \begin{bmatrix} 0 \\ 1 \end{bmatrix} = \begin{bmatrix} 0 \\ 1 \end{bmatrix}.$$

⇒ fingers 1 and 2 alone do not fully immobilize the object

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## Grasp Analysis - Mobility and Connectivity



considering fingers 1, 2, and 3, the intersection of unrestricted object velocities is empty...

$$V = \bigcap_{i=1}^{3} \mathbf{v}_{i} = \begin{bmatrix} 0 \\ 1 \end{bmatrix} \bigcap \begin{bmatrix} 0 \\ 1 \end{bmatrix} \bigcap \begin{bmatrix} 1 \\ 0 \end{bmatrix} = \emptyset,$$

...these three (fixed) contacts fully immobilize the object,

and the union of velocity constaints derived from active degrees of freedom spans  $\mathbb{R}^2$ :

$$\overline{V} = \bigcup_{i=1}^3 \ \overline{\mathbf{v}}_i = \left[ \begin{array}{c} 1 \\ 0 \end{array} \right] \bigcup \left[ \begin{array}{c} -1 \\ 0 \end{array} \right] \bigcup \left[ \begin{array}{c} 0 \\ 1 \end{array} \right] = \mathbb{R}^2$$

 $\Longrightarrow$  the object position fully controllable in the (x,y) plane by the planar hand.

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#### Grasp Analysis - Form Closure

**Definition (Form Closure)** - a condition of complete restraint in which any object twist  $\in \mathbb{R}^6$  is inconsistent with rigid body assumption for objects and fixed contacts.

form closure can be defined solely in terms of mobility
without specifying contact forces\* at all
\* form closure does not require friction

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10

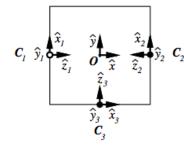
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#### Grasp Analysis - Form Closure

- Reuleaux
  - planar bodies require at least four frictionless contacts for form closure in  $\mathbb{R}^3$ , and
  - exceptional surfaces exist for which form closure is impossible given any number of frictionless point contacts.
- Somoff (1897) proved that at least 7 frictionless point contacts are necessary for form closure in  $\mathbb{R}^6$
- Mishra, Schwartz and Sharir (1987) established an upper bound of 6 frictionless point contacts on planar objects with piecewise smooth contours, and 12 for the spatial case (except for Reuleaux's exceptional surfaces).

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### The Grasp Jacobian



$$\begin{bmatrix} v_{1x} \\ v_{1z} \\ v_{2x} \\ v_{2z} \\ v_{3x} \\ v_{3z} \end{bmatrix}_C = \begin{bmatrix} 0 & 1 \\ 1 & 0 \\ 0 & 1 \\ -1 & 0 \\ 1 & 0 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} v_x \\ v_y \end{bmatrix}_O$$

$$\mathbf{v}_C = \mathbf{G}^T \mathbf{v}_O$$
, where  $\mathbf{G} = [\mathbf{v}_1 \ \overline{\mathbf{v}}_1 \ \mathbf{v}_2 \ \overline{\mathbf{v}}_2 \ \mathbf{v}_3 \ \overline{\mathbf{v}}_3]$ .

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11

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#### Wrenches and Twists

the power transmitted to the object by a contact is equal to the power generated by the contact forces:

$$\begin{aligned} \mathbf{w}_O^T \mathbf{v}_O &= \mathbf{w}_C^T \mathbf{v}_C \\ \text{but since} \;, \;\; \mathbf{v}_C &= \mathbf{G}^T \mathbf{v}_O, \\ \mathbf{w}_O^T \mathbf{v}_O &= \mathbf{w}_C^T [\mathbf{G}^T \mathbf{v}_O], \\ \mathbf{w}_O^T &= \mathbf{w}_C^T \mathbf{G}^T, \; or \\ \mathbf{w}_O &= \mathbf{G} \mathbf{w}_C. \end{aligned}$$

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#### Wrenches and Twists

so, from our planar 3-contact example:

$$\mathbf{v}_{C} = \mathbf{G}^{T} \mathbf{v}_{O}, \qquad \begin{bmatrix} v_{1x} \\ v_{1z} \\ v_{2x} \\ v_{3x} \\ v_{3z} \end{bmatrix}_{C} = \begin{bmatrix} 0 & 1 \\ 1 & 0 \\ 0 & 1 \\ -1 & 0 \\ 1 & 0 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} v_{x} \\ v_{y} \end{bmatrix}_{O}$$

$$\mathbf{w}_{O} = \mathbf{G} \mathbf{w}_{C}. \qquad \begin{bmatrix} f_{x} \\ f_{y} \end{bmatrix}_{O} = \begin{bmatrix} 0 & 1 & 0 & -1 & 1 & 0 \\ 1 & 0 & 1 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} f_{1x} \\ f_{2x} \\ f_{2z} \\ f_{3x} \\ f_{3z} \end{bmatrix}_{C}$$

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#### **Contact Types**

contact type	geometry	selection matrix $\mathbf{H}^T$ $\mathbf{w}_C = \mathbf{H}^T \boldsymbol{\lambda}$	constraints
frictionless point contact	fingerilp 1 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2	$\mathbf{w}_C = \left[egin{array}{c} 0 \ 0 \ 1 \ 0 \ 0 \ 0 \end{array} ight] [\lambda_{fz}]$	$\lambda_{fz}  \geq  0$
point contact with friction	fingerip friction cone	$\mathbf{w}_{C} = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} \lambda_{fx} \\ \lambda_{fy} \\ \lambda_{fx} \end{bmatrix}$	$\lambda_{fz} \geq 0$ $\left[\lambda_{fx}^2 + \lambda_{fy}^2\right]^{1/2} \leq \mu \lambda_{fz}$
soft finger	fingerip  object surface  Friction  object surface  fingerip  object surface  object surface object surface  object surface object surf	$\mathbf{w}_C = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 &$	$\begin{array}{rcl} \lambda_{fz} & \geq & 0 \\ \left[\lambda_{fx}^2 + \lambda_{fy}^2\right]^{1/2} & \leq & \mu \lambda_{fz} \\ \lambda_{mz} & \leq & \gamma \lambda_{fz} \end{array}$

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13

15

#### **Rotating Contact Wrenches**

given the rotation matrix  ${}_{O}\mathbf{R}_{Ci}$  that transforms vectors in contact frame i into object frame—the block diagonal

$$\overline{\mathbf{R}}_i = \left[egin{array}{c|c} O\mathbf{R}_{Ci} & \mathbf{0} \ \hline \mathbf{0} & O\mathbf{R}_{Ci} \end{array}
ight]$$

applies this rotation to the force and moment components of the contact wrench independently.

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### **Translating Contact Wrenches**

• the force component of the wrench maps to the same forces in the object frame

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#### **Translating Contact Wrenches**

• contact frame moments sum with the "couple"  $\boldsymbol{\rho} \times \boldsymbol{f}_C$ , where  $\boldsymbol{\rho} \in \mathbb{R}^3$  is the position vector locating frame  $\boldsymbol{C}$  with respect to frame  $\boldsymbol{O}$ 

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18

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#### **Translating Contact Wrenches**

$$\mathbf{P}_i = egin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \ 0 & 1 & 0 & 0 & 0 & 0 \ 0 & 0 & 1 & 0 & 0 & 0 \ 0 & -
ho_z & 
ho_y & 1 & 0 & 0 \ 
ho_z & 0 & -
ho_x & 0 & 1 & 0 \ -
ho_y & 
ho_x & 0 & 0 & 0 & 1 \ \end{bmatrix}$$

the product of matrix  $\mathbf{P}_i$  with a wrench at the contact site transforms that wrench into the equivalent wrench at the object frame.

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### Constructing a Grasp Jacobian - Algebraically

$$(\mathbf{w}_O)_i = \mathbf{G}_i \mathbf{w}_{Ci} = \mathbf{G}_i \mathbf{H}_i^T \boldsymbol{\lambda}_{Ci}$$
 contact by contact  $(\mathbf{w}_O)_i = \mathbf{G}_i^* \boldsymbol{\lambda}_{Ci}$ , where,  $\mathbf{G}_i^* = \mathbf{P}_i \overline{\mathbf{R}}_i \mathbf{H}_i^T$ .

For an n contact grasp configuration, the grasp Jacobian and effort is written

$$\mathbf{G}^* = [\mathbf{G}_1^* \cdots \mathbf{G}_n^*]$$

and,

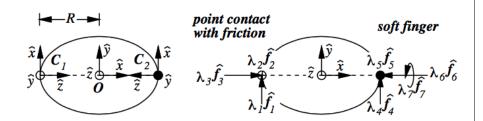
$$\boldsymbol{\lambda} = [\boldsymbol{\lambda}_{C1}^T \cdots \boldsymbol{\lambda}_{Cn}^T]^T.$$

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19

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#### Solving for Grasp Forces



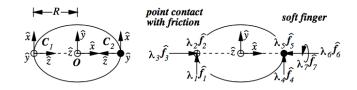
assume that unit contact forces,  $\boldsymbol{f}_i \in \mathbb{R}^3$ , are independent

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### Solving for Grasp Forces - by inspection



$$\mathbf{w}_O = egin{bmatrix} \mathbf{w}_1 & \mathbf{w}_2 & \mathbf{w}_3 & \mathbf{w}_4 & \mathbf{w}_5 & \mathbf{w}_6 & \mathbf{w}_7 \ 0 & 0 & 1 & 0 & 0 & -1 & 0 \ 1 & 0 & 0 & 1 & 0 & 0 & 0 \ 0 & 1 & 0 & 0 & -1 & 0 & 0 \ 0 & 0 & 0 & 0 & 0 & 0 & -1 \ 0 & R & 0 & 0 & R & 0 & 0 \ -R & 0 & 0 & R & 0 & 0 & 0 \end{bmatrix} egin{bmatrix} \lambda_1 \ \lambda_2 \ \vdots \ \lambda_7 \ \end{bmatrix} \ \mathbf{w}_O = egin{bmatrix} \mathbf{G}^* & \boldsymbol{\lambda} & \boldsymbol{\lambda$$

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22

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#### Prehensile Grasp Stability - Force Closure

the ability of a contact configuration to suppress random disturbances by modifying grip forces

**Definition (Force Closure)** - A grasp is force closure if a solution for contact frame wrenches  $\lambda$  exists that complies with contact type constraints such that

$$\mathbf{G}^* \boldsymbol{\lambda} = \mathbf{w}_{dist}$$
 for arbitrary  $\mathbf{w}_{dist}$ 

 $\implies$  the contact configuration is capable of generating a convex envelope of grasp wrench responses (that contains the origin). prehensile UMassAmherst

### **Grasp Stability**

...stated in another way...

$$\mathbf{w}_O = \mathbf{G}^* \boldsymbol{\lambda}$$

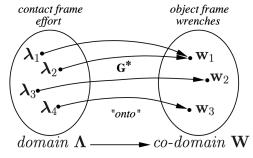
a grasp is force closure (and stabilizable) if and only if  $\mathbf{G}^*$  is surjective [Murray, Li, Sastry 1994]

**surjection** ("onto") - every object frame wrench  $\mathbf{w}_i$  is accessible by applying transform  $\overline{\mathbf{G}^*}$  to at least one combination of contact frame effort  $\boldsymbol{\lambda}$ 

### **Grasp Stability**

**surjection** ("onto") - every object frame wrench  $\mathbf{w}_i$  is accessible by applying transform  $\overline{\mathbf{G}^*}$  to at least one combination of contact frame effort  $\boldsymbol{\lambda}$ 

many-to-one



 $\forall \mathbf{w}_i \in \mathbf{W} \ \exists \boldsymbol{\lambda} \in \boldsymbol{\Lambda} \ such \ that \ \mathbf{w}_i = \mathbf{G}^* \boldsymbol{\lambda}$ 

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25

27

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### Solving for Grasp Forces

$$\mathbf{w}_O = \mathbf{G}^* \boldsymbol{\lambda} = \mathbf{G}^* (\boldsymbol{\lambda}_p + \boldsymbol{\kappa}^T \boldsymbol{\lambda}_h)$$

where solutions  $\lambda$  have homogeneous and particular parts,

$$oldsymbol{\lambda} = oldsymbol{\lambda}_p + oldsymbol{\kappa}^T oldsymbol{\lambda}_h$$

 $\lambda_h$  is the **homogeneous part** of the solution and describes combinations of contact forces that impart zero net force to the object.

$$\mathbf{G}^* oldsymbol{\lambda}_h = \mathbf{0}$$

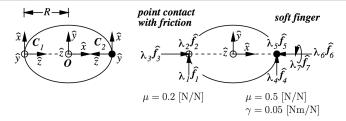
- $\bullet$  **G**\* must be full rank to achieve arbitrary reference wrenches
- $\bullet$   $\lambda$  must satisfy inequality constraints for unisense normal forces and contact friction.

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26

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### Solving for Grasp Forces

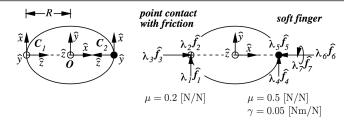


suppose: grasp forces must support an object load of  $-1.0\hat{\boldsymbol{y}}$  [N]

$$M_x = 0 \Rightarrow \lambda_7 = 0$$

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### Solving for Grasp Forces



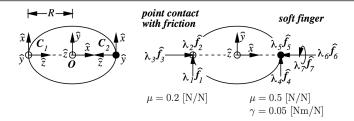
suppose: grasp forces must support an object load of  $-1.0\hat{\boldsymbol{y}}$  [N]

$$F_y = 1 \Rightarrow \lambda_1 + \lambda_4 = 1$$
  
 $M_z = 0 \Rightarrow -\lambda_1 + \lambda_4 = 0$   
 $\Rightarrow \lambda_1 = \lambda_4 = 0.5$   
particular solution

 $\lambda_7 = 0$ 

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### Solving for Grasp Forces



suppose: grasp forces must support an object load of  $-1.0\hat{\boldsymbol{y}}$  [N]

$$\lambda_1 = 0.5$$

$$\lambda_4 = 0.5$$

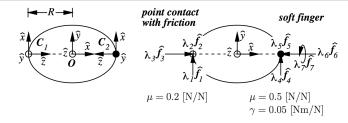
$$F_x = 0 \Rightarrow \lambda_3 - \lambda_6 = 0$$
$$\Rightarrow \lambda_3 = \lambda_6$$

$$\lambda_7 = 0$$

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### Solving for Grasp Forces



suppose: grasp forces must support an object load of  $-1.0\hat{\boldsymbol{y}}$  [N]

$$\lambda_1 = 0.5$$

$$\lambda_3 = \lambda_6$$

$$\lambda_4 = 0.5$$

$$F_z = 0 \Rightarrow \lambda_2 - \lambda_5 = 0$$

$$M_y = 0 \Rightarrow \lambda_2 + \lambda_5 = 0$$

$$\Rightarrow \lambda_2 = \lambda_5 = 0$$

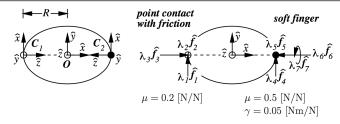
$$\lambda_7 = 0$$

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30

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### Solving for Grasp Forces



suppose: grasp forces must support an object load of  $-1.0\hat{\boldsymbol{y}}$  [N]

$$\begin{array}{c} \lambda_1=0.5\\ \lambda_3=\lambda_6\\ \lambda_4=0.5\\ \lambda_2=\lambda_5=0\\ \lambda_7=0 \end{array} \qquad \begin{array}{c} \text{frictional constraints}\\ \lambda_1\leq\mu\lambda_3\\ 0.5\leq(0.2)\lambda_3\\ \lambda_3\geq2.5 \end{array}$$

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29

31

### Solving for Grasp Forces

$$\lambda_1 = 0.5$$
 $\lambda_3 = \lambda_6$ 
 $\lambda_4 = 0.5$ 
 $\lambda_2 = \lambda_5 = 0$ 
 $\lambda_1 \leq \mu \lambda_3$ 
 $0.5 \leq (0.2)\lambda_3$ 
 $\lambda_3 \geq 2.5$ 

$$\lambda = \lambda_p + \kappa^T \lambda_h = \begin{bmatrix} 0.5 & 0 & 0 & 0.5 & 0 & 0 & 0 \end{bmatrix}_p^T + \kappa \begin{bmatrix} 0 & 0 & 1 & 0 & 0 & 1 & 0 \end{bmatrix}_h^T$$
  
and,  $\kappa \geq 2.5$  satisfies frictional constraints

automated techniques based on mathematical programming are used to solve these systems subject to contact type constraints

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#### Force Closure Revisited

- 1. The grasped object is in quasistatic equilibrium, there are no net forces or moments,
- 2. all forces are applied within the cone of friction so that there is no slippage, and,
- 3. an externally applied force can be resisted by finger forces with a finite and controllable deflection.

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33

35

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### **Grasp Synthesis**

grasp analysis vs. grasp synthesis

once we have a grasp geometry, grasp analysis provides a grasp force solution

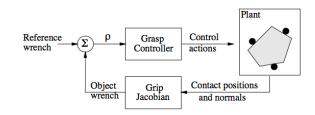
but, how is a grasp geometry determined?

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### Closed-Loop, Sensor-Driven Grasp Control



$$\Phi = \boldsymbol{\rho}^T \mathbf{M} \boldsymbol{\rho}$$

$$= \left(\frac{1}{k} \sum_{i=1}^k \boldsymbol{\omega}_i\right)^T \mathbf{M} \left(\frac{1}{k} \sum_{i=1}^k \boldsymbol{\omega}_i\right)$$

the control Jacobian,  $J_c$ , is the partial of  $\varphi$  with respect to contact coordinates q

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### Navigation Function - Grasp Control

1. The grasped object is in quasistatic equilibrium, there are no net forces or moments,



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