# Impact-aware humanoid robot motion generation with a quadratic optimization controller

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### Outline I



- 2 Impact-awareness of a QP controller
- Impact-aware multi-contact motion generation
- 4 Experiments

### Impact can lead to instant failure

Impact is too fast to be compensated !



- Contact velocity 1.17*m*/*s*.
- Plastic material
- Peak force: 4.5kN.

Pashah, Sulaman, Michel Massenzio, and Eric Jacquelin. "Prediction of structural response for low velocity impact."

International Journal of Impact Engineering 35.2 (2008): 119-132.

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# Why does a robot fear impact?





For all the robots:

- Damage hardware, e.g. motors, harmonics.
- Unclear post-impact status: Rebounce? Sticking? Or slip?
- Equations of motions differ

#### Plus:

- Rigid environment and robot
- Unknown contact location

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For floating-based robots:

- Disturbing the standing stability.
- Breaking established contacts.

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For all the robots:

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Avoid impacts or use close-to-zero contact velocity.

ot



- Unknown contact location
- For floating-based robots:
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For all the robots:



### Impact-awareness of a QP controller

3) Impact-aware multi-contact motion generation



### State jumps and constraints

- Hardware feasibility:
  - Limited joint velocity
  - Limited joint torque
- Under-actuated robots:
  - Established contacts
  - Standing stability criteria

# State jumps and constraints

- Hardware feasibility:
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Controller feasibility:

- Joint velocity constraints
- Joint torque constraints

Force-dependent constraints:

- Fulfilling the contact wrench cone
- ZMP constraint

We propose:

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If we can derive the linear dependence:

State jump = 
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  $\overset{\textbf{q}}{\underbrace{\textbf{q}}}_{\text{decision variable}}$ 

We propose:

#### Post-impact state $\leq$ Bounds

Re-write the above:

(Pre-impact state( $\ddot{q}$ ) + State jump)  $\leq$  Bounds

If we can derive the linear dependence:

State jump = 
$$D$$
  
decision variable  
The task-space QP is impact aware!

### Predict state jumps as symbolic expressions of $\ddot{q}$

#### Analytical impact dynamics model



• Kinematic impact dynamics model:

$$\Delta \dot{\boldsymbol{x}}_{k+1} = \dot{\boldsymbol{x}}_{k+1}^+ - \dot{\boldsymbol{x}}_{k+1}^- = \underbrace{-(1+c_r)\boldsymbol{\mathsf{P}}_n}_{\boldsymbol{\mathsf{P}}_{\Delta}} \dot{\boldsymbol{x}}_{k+1}^-.$$

• Symbolic expression (linear function of  $\ddot{q}$ ):

$$\Delta \dot{\boldsymbol{x}}_{k+1} = \boldsymbol{\mathsf{P}}_{\Delta} (\boldsymbol{J}_k \dot{\boldsymbol{q}}_k + \boldsymbol{J}_k \ddot{\boldsymbol{q}}_k \Delta t + \dot{\boldsymbol{J}}_k \dot{\boldsymbol{q}}_k \Delta t),$$

Zheng, Yuanfang, and Hooshang Hemami. "Mathematical modeling of a robot collision with its environment.

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### The analytical solution of a 3D Impact is UNKNOWN

- Stewart, David E. "Rigid-body dynamics with friction and impact." SIAM review 42.1 (2000): 3-39.
- Featherstone, Roy. Rigid body dynamics algorithms. Springer, 2014.
- Jia, Yan-Bin, and Feifei Wang. "Analysis and computation of two body impact in three dimensions." Journal of Computational and Nonlinear Dynamics 12.4 (2017): 041012.
- Jia, Yan-Bin, Matthew Gardner, and Xiaoqian Mu. "Batting an in-flight object to the target." The International Journal of Robotics Research (2019): 0278364918817116.

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# Predict state jumps as symbolic expressions of $\ddot{q}$



Joint velocity constraints:

 $\dot{q} \leq \mathsf{Bounds}.$ 

Recall:

 $(Pre-impact state(\ddot{q}) + State jump) \le Bounds$ 

Joint velocity constraints:

 $\dot{q} \leq \mathsf{Bounds}.$ 

Impact-aware joint velocity constraints:

$$\dot{q}_{k+1}^{-} + \underbrace{\Delta \dot{q}_{k+1}}_{\text{Linear w.r.t.}} \leq \text{Bounds}$$





Wang Y and Kheddar A (2019) Impact-friendly robust control design with task-space quadratic optimization. In: Proceedings of Robotics: Science and Systems, volume 15, Freiburg, Germany,



Open source: https://github.com/wygsnddd/pyOpController







Impact-aware multi-contact motion generation



### Whole-body state jumps



Impact-aware multi-contact motion generation

Symbolic expression of the whole-body state-jumps

### Whole-body state jumps



### Predictable impulse: I

# Whole-body state jumps



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### Whole-body state jumps



# Impulse Distribution Quadratic Programming (IDQP)

- $\min_{\Delta \dot{q},I} \quad \text{Sum of momentum jumps}$
- s.t. Task space: End-effector Momentum jump = external impulse

Centroidal frame: Momentum jump = Sum of external impulses

Controlled impacts: Generalized momentum jump = Known impulse

Impact-aware multi-contact motion generation

Symbolic expression of the whole-body state-jumps

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$$\begin{bmatrix} \Delta \dot{\mathbf{x}}_{\sigma_{contact}} \\ \Delta \dot{\mathbf{x}}_{\sigma_{impact}} \\ \Delta \dot{\mathbf{x}}_{\sigma_{free}} \end{bmatrix} = \begin{bmatrix} \Upsilon_{\sigma_{contact},\sigma_{contact}}, & \Upsilon_{\sigma_{contact},\sigma_{impact}}, & \Upsilon_{\sigma_{contact},\sigma_{free}} \\ \Upsilon_{\sigma_{impact},\sigma_{contact}}, & \Upsilon_{\sigma_{impact},\sigma_{impact},\sigma_{free}} \\ \Upsilon_{\sigma_{free},\sigma_{contact}}, & \Upsilon_{\sigma_{free},\sigma_{impact}}, & \Upsilon_{\sigma_{impact},\sigma_{free}} \\ \mathbf{0} \end{bmatrix}$$
Centroidal frame: Momentum jump = Sum of external impulses
$$A_{G}(\theta)\Delta \dot{q} = \sum \mathbf{I}_{\sigma_{contact}} + \sum \mathbf{I}_{\sigma_{impact}}$$
Controlled impacts: Generalized momentum jump = Known impulse
$$\mathbf{J}_{i}\Delta \dot{q} = \Delta \dot{\mathbf{x}}_{i} \text{ for } i \in \sigma_{impact}.$$

Symbolic expression of the whole-body state-jumps

# Impulse Distribution Quadratic Programming (IDQP)



Symbolic expression of the whole-body state-jumps

# Impulse Distribution Quadratic Programming (IDQP)



s.t. Task space: End-effector Momentum jump = external impulse External impulses from established contacts:  $I_l(\dot{q}) = I_r(\ddot{q})$ .

Other state jump: 
$$\Delta z(\ddot{q}), \Delta \xi(\ddot{q}), \Delta \dot{c}(\ddot{q}).$$

Centroidal frame: Momentum jump = Sum of external impulses Centroidal momentum jump:  $\Delta P(\mathbf{\ddot{q}})$ ,  $\Delta \mathcal{L}(\mathbf{\ddot{q}})$ .

Controlled impacts: Generalized momentum jump = Known impulse

End-effector velocity jump of a free limb:  $\Delta \dot{x}(\ddot{q})$ .

σ<sub>impact</sub>

Constrained ZMP:

### $z \leq \text{Bounds} \Rightarrow z + \Delta z(\ddot{q}) \leq \text{Bounds}$

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#### Constrained ZMP:

 $m{z} \leq \mathsf{Bounds} \quad \Rightarrow \quad m{z} + \Delta m{z}(\ddot{m{q}}) \leq \mathsf{Bounds}$ 

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#### Constrained COM velocity:

 $\dot{\boldsymbol{c}} \leq \mathsf{Bounds} \quad \Rightarrow \quad \dot{\boldsymbol{c}} + \Delta \dot{\boldsymbol{c}}(\ddot{\boldsymbol{q}}) \leq \mathsf{Bounds}$ 

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Seamless integration to the whole-body QP controller.

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- 2) Impact-awareness of a QP controller
- 3 Impact-aware multi-contact motion generation



### Restrict ZMP strictly inside the support polygon



Reference contact velocity: 0.8 m/s.

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# Box-grabbing controller



### Reference contact velocity: 0.15 m/s.

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### From support polygon to multi-contact COM area





Caron S, Pham QC and Nakamura Y (2017) Zmp support areas for multi-contact mobility under frictional constraints. IEEE Transactions on Robotics 33(1): 67-80.

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### Push an unknown wall with energetic impacts



Reference contact velocity: 0.8 m/s.

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### Impact force stabilization



# Real-time updating the multi-contact areas



### Summary:

Contributions:

- Controlled state jumps: Δd(q̈).
- Autonomously *filters* the contact velocity:  $\dot{\mathbf{x}} = \text{feasible}(\dot{\mathbf{x}}^{\text{ref}})$ .
- Hardware limits and standing stability margins are respected.
- Robust to impact timing or location
- No reset maps or offline trajectory generation.

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Future work:

- Frictional impact dynamics model in 3D.
- Refined impulse propagation.
- Off-line and on-line parameter identification, e.g., coefficient of restitution.
- Investigate the tangential impulse.

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### Pre-print:

Impact-Aware Task-Space Quadratic-Programming Control
https://hal.archives-ouvertes.fr/hal-02741682/

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