# FACULTY OF ELECTRICAL ENGINEERING AND COMPUTING, UNIVERSITY OF ZAGREB







# State-of-the-Art Survey of Manifold Based Control Methods for Unmanned Aerial Vehicles

PhD Qualifying Exam

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#### Research Area

- Unmanned Aerial Vehicles (UAVs)
- Attitude  $(\phi, \theta, \psi)$  and Position (x, y, z) control
- Mathematical model embedded with a manifold structure
- Two frameworks considered:
  - Geometric Mechanics and Control
  - Passive Decomposition



#### Why Manifolds? (1)

UAV configuration space:

$$\zeta = [x, y, z, \phi, \theta, \psi] \xleftarrow{f_{\mathsf{T}_0}(\mathsf{T})} \mathsf{T} = \begin{bmatrix} \mathsf{R} & \mathsf{p} \\ \mathbf{0} & 1 \end{bmatrix}_{4 \times 4} \tag{1}$$

$$\zeta \in \mathbb{R}^6 \,, \ \mathsf{T} \in \mathsf{SE}(3) \,, \ \mathsf{R} \in \mathsf{SO}(3)$$
 (2)

- Lie Group
  - set of smooth differentiable manifolds
  - group multiplication and inversion properties
  - e.g. SO(3), SE(3), S<sup>2</sup>



## Why manifolds? (2)

- Compact model dynamics represented as a Lagrangian / Hamiltonian system
- Coordinate-free approach
- No singularities
- No ambiguities



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#### Geometric Mechanics

- Introduced by:
  - F. Bullo and A. Lewis, 2005.<sup>1</sup>
  - T. Lee, 2008.<sup>2</sup>
  - T. Lee et al. 2018.<sup>3</sup>
- Rotating rigid body dynamics equation:

$$m\ddot{\mathbf{x}} + mg\mathbf{e}_3 = f\mathbf{R}\mathbf{e}_3 \tag{3}$$

$$\mathsf{J}\dot{\Omega} + \Omega \times \mathsf{J}\Omega = \mathsf{M}$$
 (4)

$$\dot{\mathsf{R}} = \mathsf{R}\widehat{\mathbf{\Omega}} \tag{5}$$

<sup>&</sup>lt;sup>3</sup>Taeyoung Lee, Melvin Leok, and N. Harris McClamroch, Global formulations of Lagrangian and Hamiltonian dynamics on manifolds: a geometric approach to modeling and analysis, Interaction of mechanics and mathematics series (Springer, 2018).



<sup>&</sup>lt;sup>1</sup>Andrew D. Lewis Francesco Bullo, Geometric control of mechanical systems: modeling, analysis, and design for simple mechanical control systems, 1st ed., Texts in applied mathematics 49 (Springer, 2005).

<sup>&</sup>lt;sup>2</sup>Taeyoung Lee, "Computational geometric mechanics and control of rigid bodies" (2008).

## Geometric Control (1)

- PD control with nonlinear terms
- First developed by T. Lee et al. 2010.<sup>4</sup>
- T. Lee et al. 2011.<sup>5</sup> Robust geometric control
- Kotaru et al. 2019.<sup>6</sup> L1 Aadaptive controller
- S. Lee et al. 2019.<sup>7</sup> Parameter tuning optimization

<sup>&</sup>lt;sup>7</sup>Seongheon Lee and Hyochoong Bang, "Automatic Gain Tuning Method of a Quad-Rotor Geometric Attitude Controller Using A3C" (2019).



 $<sup>^4</sup>$ T. Lee, M. Leok, and N. H. McClamroch, "Geometric tracking control of a quadrotor UAV on SE(3)" (2010): 5420–5425.

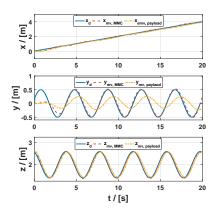
<sup>&</sup>lt;sup>5</sup>T. Lee, M. Leok, and N. Harris McClamroch, "Nonlinear Robust Tracking Control of a Quadrotor UAV on SE(3)", ArXiv e-prints (Sept. 2011).

 $<sup>^6</sup>$ Prasanth Kotaru, Ryan S. Edmonson, and Koushil Sreenath, "Geometric L1 Adaptive Attitude Control for a Quadrotor UAV" (2019).

# Geometric Control (2)<sup>8</sup>



Figure: Two UAVs endowed with variable center of gravity by moving masses and manipulator carried payload (top). Position tracking results (right)<sup>8</sup>.



 $<sup>^8</sup>$ Lovro Markovic et al., "Geometric Tracking Control of Aerial Robots Based on Centroid Vectoring" (June 2019).



# Gemetric Control - Transportation Tasks (1)

- Introduced by T. Lee and V. Kumar 2013.<sup>9</sup>
- A. Goodarzi and T. Lee 2015.<sup>10</sup> Multiple quadrotors employed
- A. Goodarzi and T. Lee 2015.<sup>11</sup> and A. Goodarzi et al. 2013.<sup>12</sup> -Adaptive control with unknown mass variations

<sup>&</sup>lt;sup>12</sup>Farhad A. Goodarzi, Daewon Lee, and Taeyoung Lee, "Geometric Stabilization of Quadrotor UAV with a Payload Connected by Flexible Cable" (2013).



 $<sup>^9</sup>$ K. Sreenath, T. Lee, and V. Kumar, "Geometric control and differential flatness of a quadrotor UAV with a cable-suspended load" (2013): 2269–2274.

 $<sup>^{10}</sup>$ Farhad A. Goodarzi and Taeyoung Lee, "Stabilization of a Rigid Body Payload with Multiple Cooperative Quadrotors" (2015).

<sup>&</sup>lt;sup>11</sup>Farhad A. Goodarzi and Taeyoung Lee, "Dynamics and control of quadrotor UAVs transporting a rigid body connected via flexible cables", 2015 American Control Conference (ACC) (2015): 4677–4682.

# Geometric Control - Transportation Tasks $(2)^{13}$

- Multiple quadrotor UAVs carrying a rigid body payload via cables
- Cable configuration lies in S<sup>2</sup> spherical Lie group
- Complete system configuration lies in  $SE(3) \times S^2$
- Payload position and attitude tracking problem

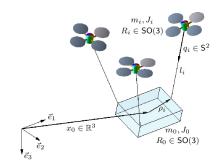


Figure: Payload transportation with multiple UAVs<sup>13</sup>

<sup>&</sup>lt;sup>13</sup>Taeyoung Lee, "Geometric control of multiple quadrotor UAVs transporting a cable-suspended rigid body", 53rd IEEE Conference on Decision and Control (2014): 6155–6160.



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#### Passive Decomposition

- First introduced by D. Lee 2008.<sup>14</sup>
- Proposed system dynamics split:
  - Shape internal configuration of each robot
  - Locked current overall behavior of multiple robot systems
  - Coupled interaction between locked and shape dynamics
- Passive decomposition
  - Applying a control law to cancel the dynamics coupling terms without energy generation
  - Enforces energetic passivity

<sup>&</sup>lt;sup>14</sup>Dongjun Lee, "Passive Decomposition of Multiple Nonholonomic Mechanical Systems under Motion Coordination Requirements". IFAC Proceedings Volumes 41.2 (2008): 4367–4373.



## Passive Decomposition - QM systems<sup>15</sup> 16

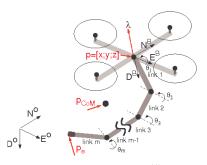


Figure: QM system<sup>15</sup>

- Decoupled quadrotor-manipulator(QM) system:
  - center-of-mass dynamics in E(3)
  - Robotic manipulator Lagrange dynamics
- End-effector control law:
  - Backstepping-like controller<sup>15</sup>
  - PID cascade<sup>16</sup>

<sup>&</sup>lt;sup>16</sup>Nebi Bulut, Ali Turgut, and Kutluk Arikan, "Decoupled Cascaded PID Control of an Aerial Manipulation System", Hittite Journal of Science and Engineering 6.4 (2019): 251–259.



<sup>&</sup>lt;sup>15</sup>Hyunsoo Yang and Dongjun Lee, "Dynamics and control of quadrotor with robotic manipulator", 2014 IEEE International Conference on Robotics and Automation (ICRA) (2014): 5544–5549.

### Passivity Based Control - Payload Transportation

- C. Meissen et al. 2017.<sup>17</sup> General formation and internal control laws
- M E. Guerrero et al. 2015.<sup>18</sup> An Interconnection and Damping Assignment - Passivity Based Control (IDA-PBC) for payload swing suppression
- P. Prajapati et al. 2019.<sup>19</sup> Master-slave transportation strategy with human-in-the-loop

<sup>&</sup>lt;sup>19</sup>P. Prajapati, S. Parekh, and V. Vashista, "Collaborative Transportation of Cable-Suspended Payload using Two Quadcopters with Human in the loop" (2019): 1–6.



 $<sup>^{17} \</sup>mbox{Chris}$  Meissen et al., "Passivity-based Formation Control for UAVs with a Suspended Load", IFAC-PapersOnLine 50.1 (2017): 13150 -13155.

 $<sup>^{18}</sup>$ M. E. Guerrero et al., "Passivity based control for a quadrotor UAV transporting a cable-suspended payload with minimum swing" (2015): 6718–6723.

## Passivity Based Control - Aerial Compliance (1)

- E. Spyrakos et al. 2019.<sup>20</sup> Manipulator passivity preservation control (PPC)
- Q. Delamare 2019.<sup>21</sup> Exploiting physical contact to achieve flight maneuvers
- M. Schuster et al. 2019.<sup>22</sup> Energy efficient approach to maximum in-flight wrench generation

<sup>&</sup>lt;sup>22</sup>Micha Schuster et al., "Comparison of design approaches of fully actuated aerial robots based on maximum wrench generation and minimum energy consumption". IFAC-PapersOnLine 52.15 (2019): 603 –608.



<sup>&</sup>lt;sup>20</sup>E. Spyrakos-Papastavridis, P. R. N. Childs, and J. S. Dai, "Passivity Preservation for Variable Impedance Control of Compliant Robots". IEEE/ASME Transactions on Mechatronics (2019): 1–1.

<sup>&</sup>lt;sup>21</sup>Quentin Delamare, "Algorithms for estimation and control of quadrotors in physical interaction with their environment", Theses, Univ Rennes, Inria, CNRS, IRISA, France, 2019.

## Passivity Based Control - Aerial Compliance (2)

 R. Rashad et al. 2019.<sup>23</sup> - Passivity based control of a fully actuated UAV for aerial physical interaction near hovering by



Figure: A fully-actuated hexarotor UAV applying force to a vertical surface.

<sup>&</sup>lt;sup>23</sup>R. Rashad, F. Califano, and S. Stramigioli, "Port-Hamiltonian Passivity-Based Control on SE(3) of a Fully Actuated UAV for Aerial Physical Interaction Near-Hovering", IEEE Robotics and Automation Letters 4.4 (2019): 4378–4385.

# Passivity Based Control - Notable Mentions (1)

- Y. larashi et al. 2009.<sup>24</sup>
  - Passivity based motion coordination of rigid bodies by exchanging information over connected graphs
- H. Yang and D. Lee 2015.<sup>25</sup>
  - A hierarchical cooperative control framework
  - Endowment of a common grasped object with desired behavior (e.g., trajectory tracking, compliant interaction, etc.)

<sup>&</sup>lt;sup>25</sup>H. Yang and D. Lee, "Hierarchical cooperative control framework of multiple quadrotor-manipulator systems" (2015): 4656–4662.



<sup>&</sup>lt;sup>24</sup>Y. Igarashi et al., "Passivity-Based Attitude Synchronization in \$SE(3)\$", IEEE Transactions on Control Systems Technology 17.5 (Sept. 2009): 1119–1134.

## Passivity Based Control - Notable Mentions (2)

- P. Robuffo Giordano et al. 2011.<sup>26</sup>
  - Experimental validation of a decentralized passivity-based control strategy for teleoperating a group UAVs
  - Master UAV (human-in-the-loop) controls the group motion and receives feedback about the remote slave motion status
- D. Lee et al. 2013.<sup>27</sup>
  - Semi-autonomous haptic teleoperation control architecture for multiple UAVs

<sup>&</sup>lt;sup>27</sup>D. Lee et al., "Semiautonomous Haptic Teleoperation Control Architecture of Multiple Unmanned Aerial Vehicles", IEEE/ASME Transactions on Mechatronics 18.4 (2013): 1334–1345.



<sup>&</sup>lt;sup>26</sup>P. Robuffo Giordano et al., "Experiments of passivity-based bilateral aerial teleoperation of a group of UAVs with decentralized velocity synchronization" (2011): 163–170.

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#### Conclusion

- An overview of geometric and passivity based control methods
- General frameworks application opportunities
- ???



## Future Work (2)

Autonomous Wind-Turbine Blade Inspection



Figure: UAV equipped with a Velodyne VLP-16 LiDAR while performing a manually operated inspection.

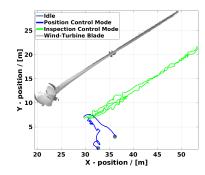


Figure: Inspection trajectory and a wind-turbine model.



## Future Work (3)





# References (1)

- Bulut, Nebi, Ali Turgut, and Kutluk Arikan. "Decoupled Cascaded PID Control of an Aerial Manipulation System". *Hittite Journal of Science and Engineering* 6.4 (2019): 251–259. Print.
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  - —. "Stabilization of a Rigid Body Payload with Multiple Cooperative Quadrotors". (2015). Print.
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- Igarashi, Y., et al. "Passivity-Based Attitude Synchronization in \$SE(3)\$". *IEEE Transactions on Control Systems Technology* 17.5 (Sept. 2009): 1119–1134. Print.
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  - Lee, Taeyoung, Melvin Leok, and N. Harris McClamroch. *Global formulations of Lagrangian and Hamiltonian dynamics on manifolds: a geometric approach to modeling and analysis.*Springer, 2018. Print. Interaction of mechanics and mathematics series.
  - Markovic, Lovro, et al. "Geometric Tracking Control of Aerial Robots Based on Centroid Vectoring". (June 2019). Print.

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- Meissen, Chris, et al. "Passivity-based Formation Control for UAVs with a Suspended Load". *IFAC-PapersOnLine* 50.1 (2017). 20th IFAC World Congress: 13150 –13155. Print.
- Prajapati, P., S. Parekh, and V. Vashista. "Collaborative Transportation of Cable-Suspended Payload using Two Quadcopters with Human in the loop". (2019): 1–6. Print.
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- Robuffo Giordano, P., et al. "Experiments of passivity-based bilateral aerial teleoperation of a group of UAVs with decentralized velocity synchronization". (2011): 163–170. Print.
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    Print.
- Yang, Hyunsoo and Dongjun Lee. "Dynamics and control of quadrotor with robotic manipulator". 2014 IEEE International Conference on Robotics and Automation (ICRA) (2014): 5544–5549. Print.