



# *optiPilot*

*low altitude flight and  
collision avoidance*

# *The problem at hand*



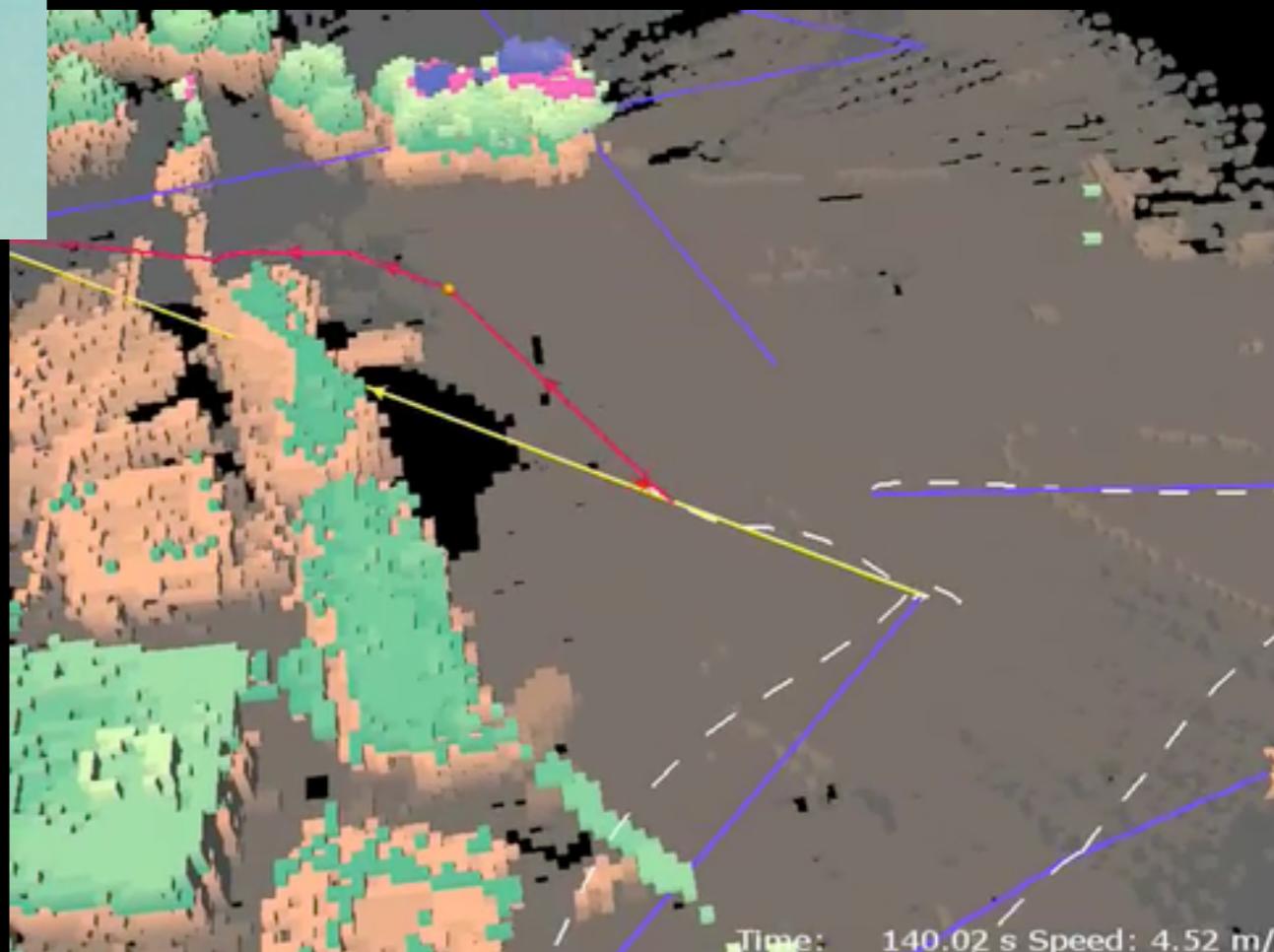


# *The classical approach*



- 3D mapping of the environment
  - 75 kg Yamaha helicopter
  - 2D scanning LIDAR (3 kg)
  - GPS+IMU-based low level control
- => heavy sensors
- => significant computational power & memory

Scherer et al., CMU



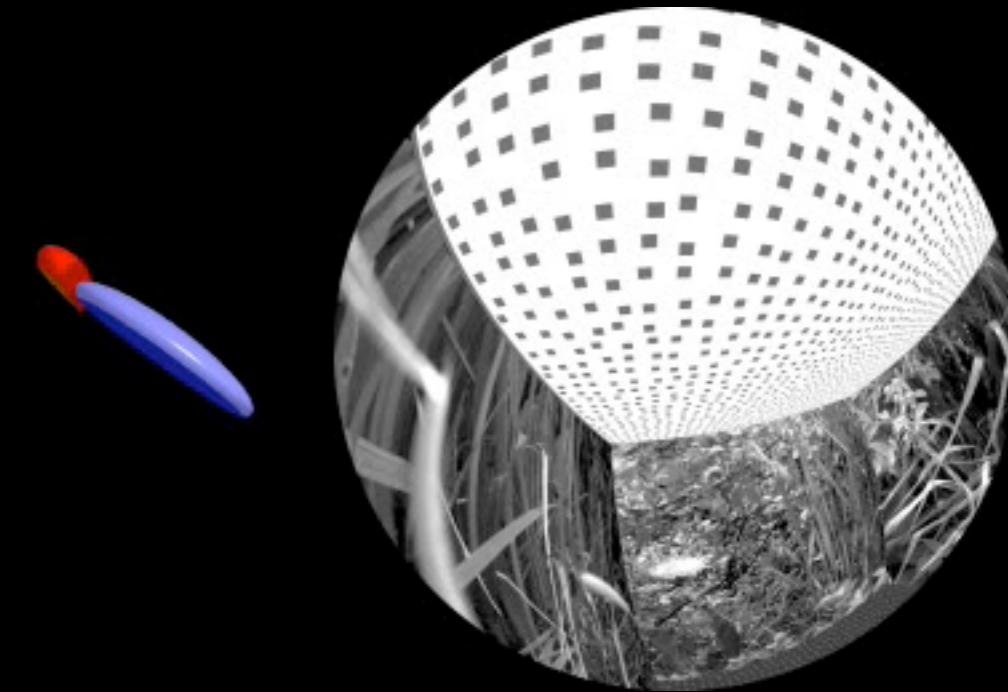
# *How do flying insects solve that problem?*

- No 3D map of their environment and no GPS
- No active distance sensors, but:
  - low-resolution, fast, 360° vision (optic flow)
  - rate gyros
  - airspeed
- Mostly reactive control



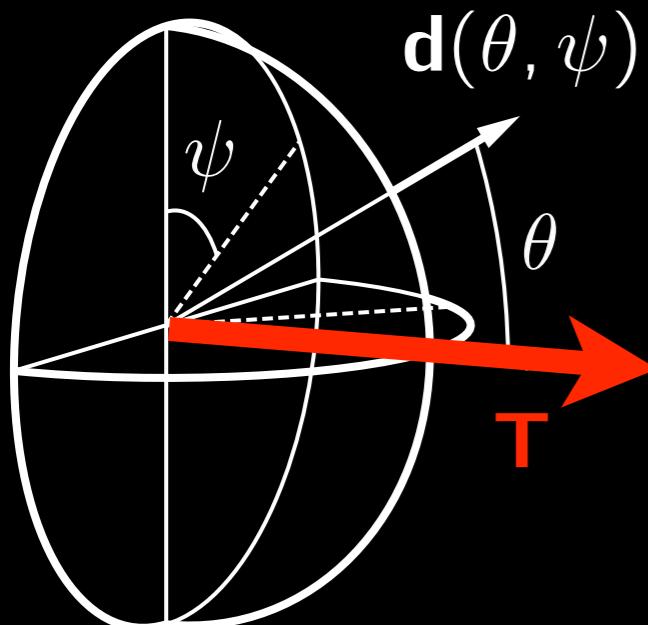
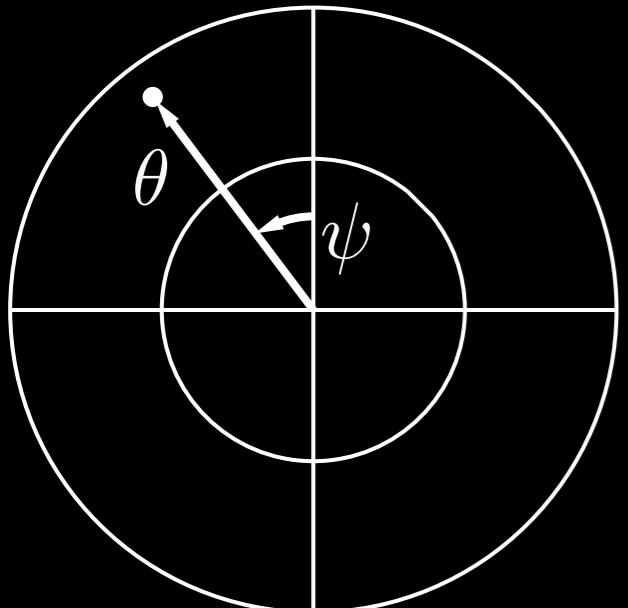
# *How to turn optic flow into proximity estimates?*

- Derotation
- Motion constraints
  - orientation of translation vector
  - amplitude of translation vector
- Chose the right viewing directions
- Assumptions: no wind, static environment
- Let's consider a spherical camera model...



Kern, R., van Hateren, J.H., Michaelis, C., Lindermann, J.P., Egelhaaf, M.  
PLOS Biology, 2005

# Optic-flow-based proximity estimation



Motion parallax

Proximity estimation

translational optic flow

$$\mathbf{p}(\theta, \psi) = \frac{\mathbf{T} - (\mathbf{T} \cdot \mathbf{d}(\theta, \psi)) \cdot \mathbf{d}(\theta, \psi)}{D(\theta, \psi)}$$

$$\mathbf{p}_T(\theta, \psi)$$

rotational optic flow

$$- \mathbf{R} \times \mathbf{d}(\theta, \psi)$$

$$\mathbf{p}_R(\theta, \psi)$$

translations are difficult  
to measure, **but predictable**  
**in translation flight**

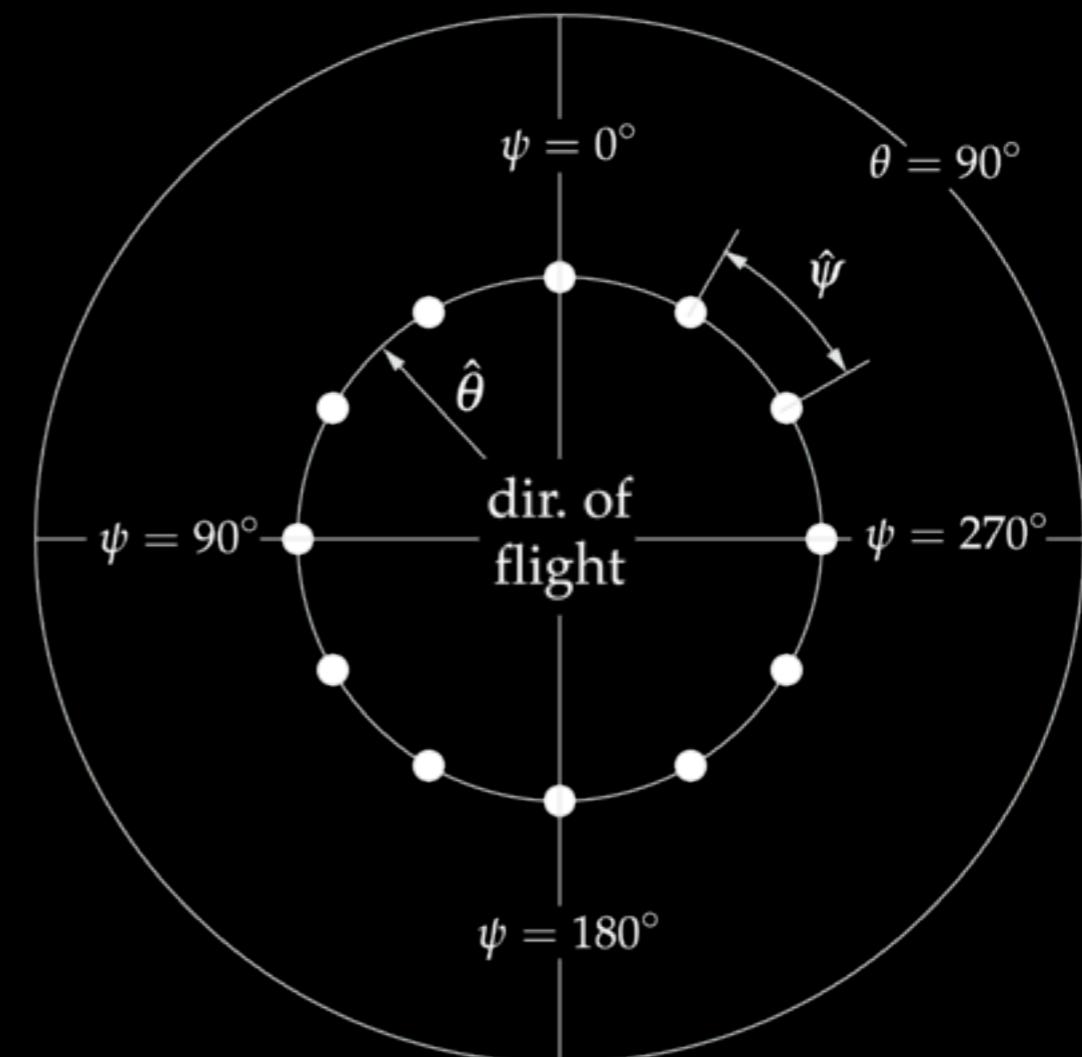
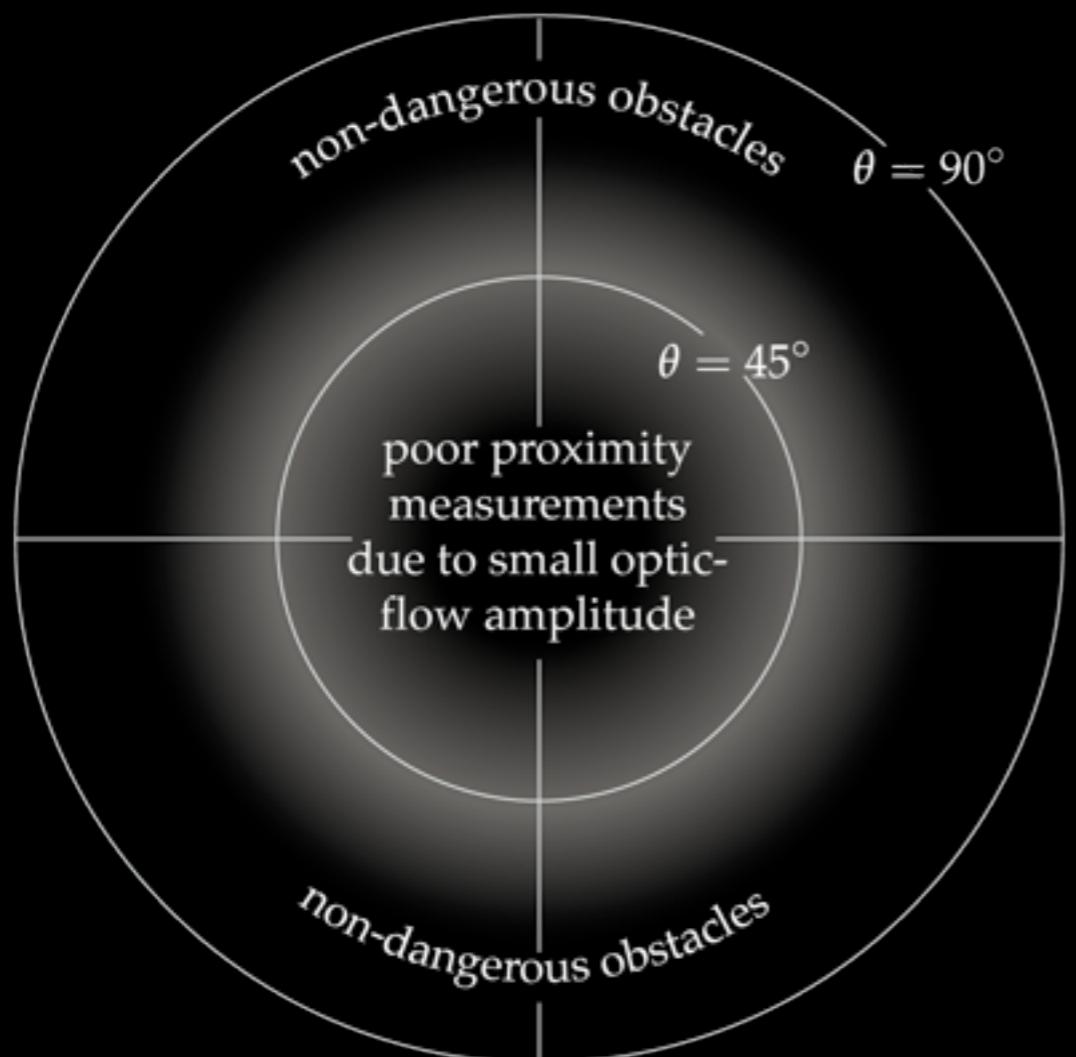
rotations can be  
measured from  
rate gyroscopes



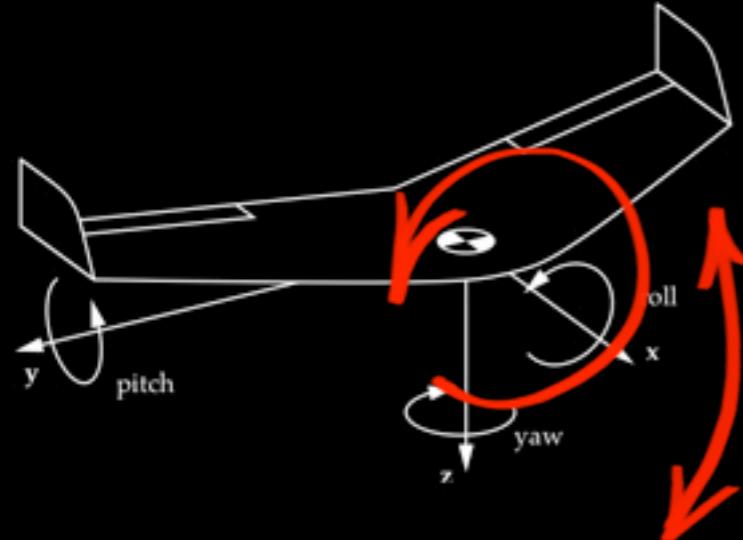
$$p_T = \frac{|\mathbf{T}|}{D} \cdot \sin \angle(\mathbf{T}, \mathbf{d}) \quad \angle(\mathbf{T}, \mathbf{d}) = \theta$$

$$\mu(\theta, \psi) = \frac{1}{D(\theta, \psi)} = \frac{p_T(\theta, \psi)}{|\mathbf{T}| \cdot \sin \theta}$$

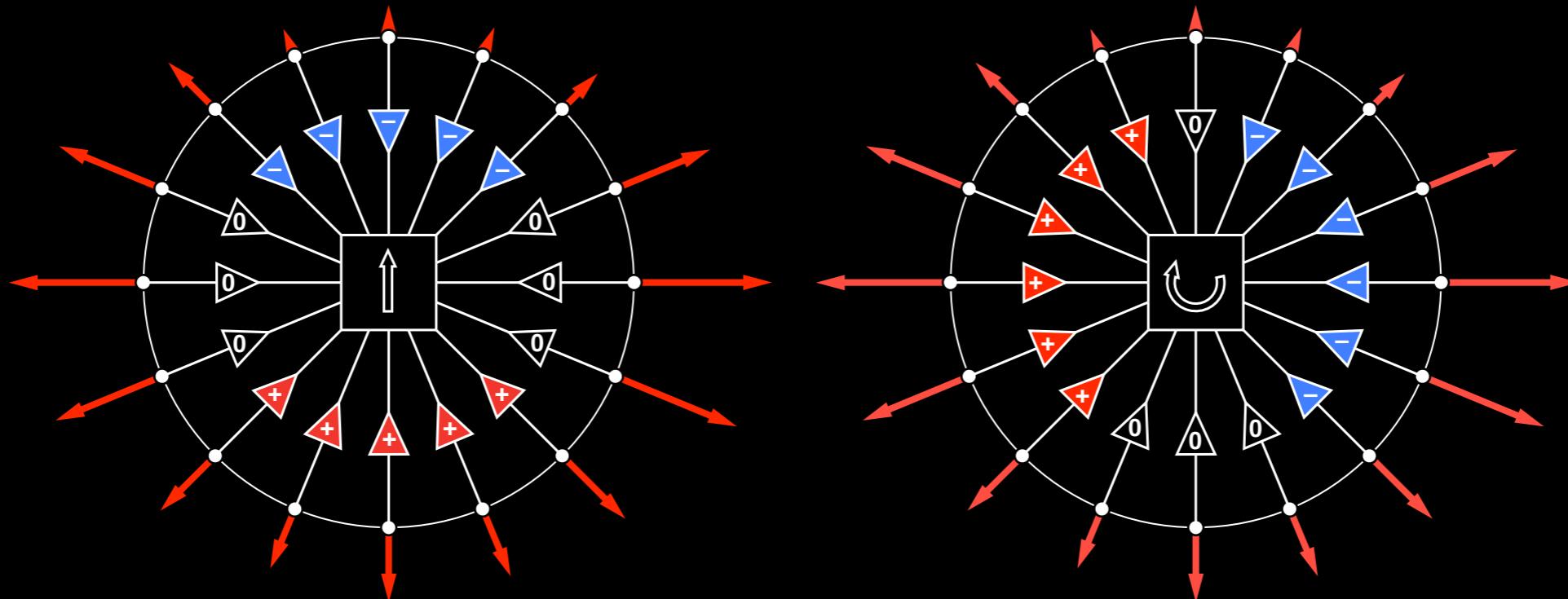
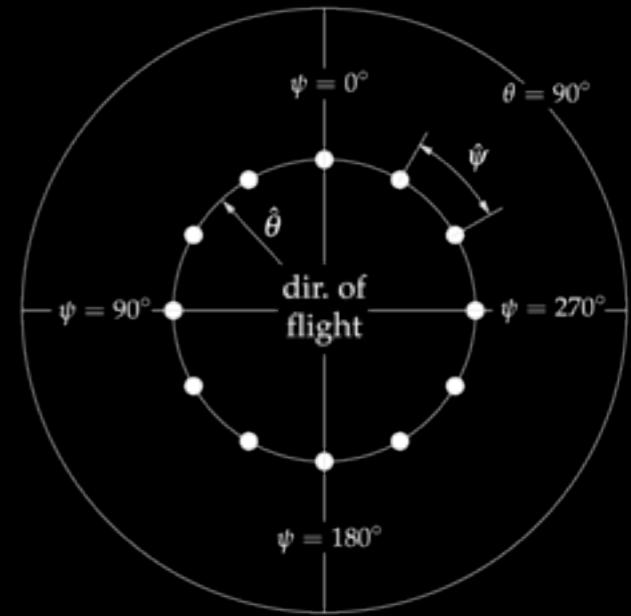
# *Choice of viewing direction*



# Control signal generation

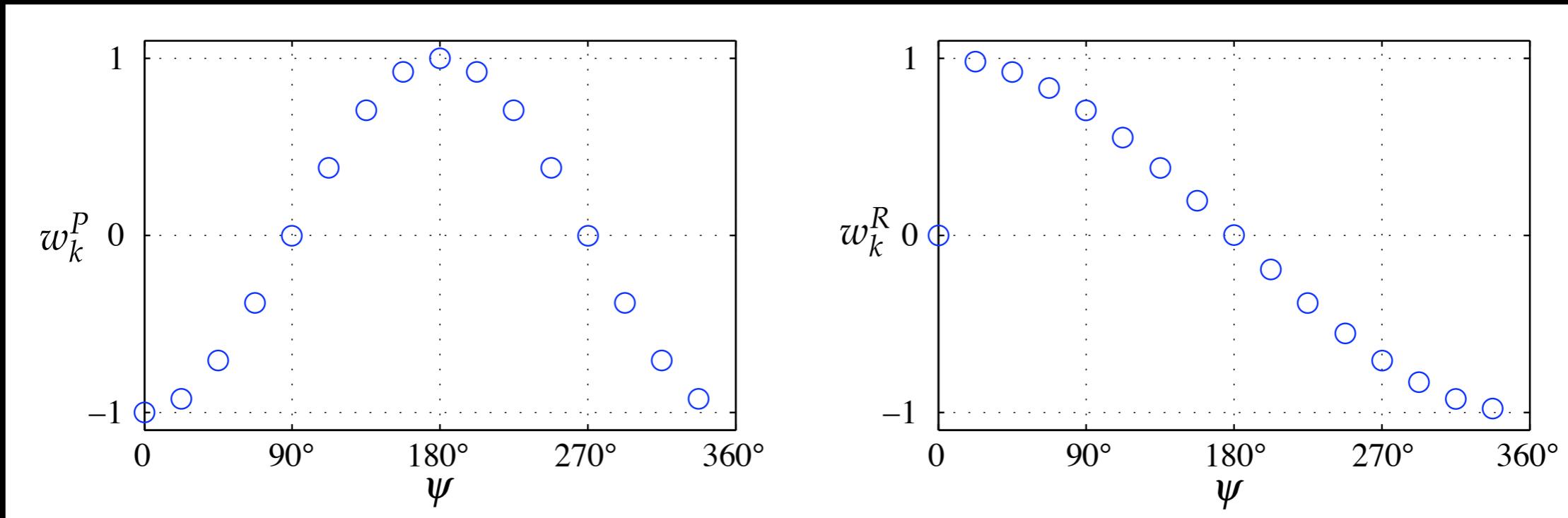
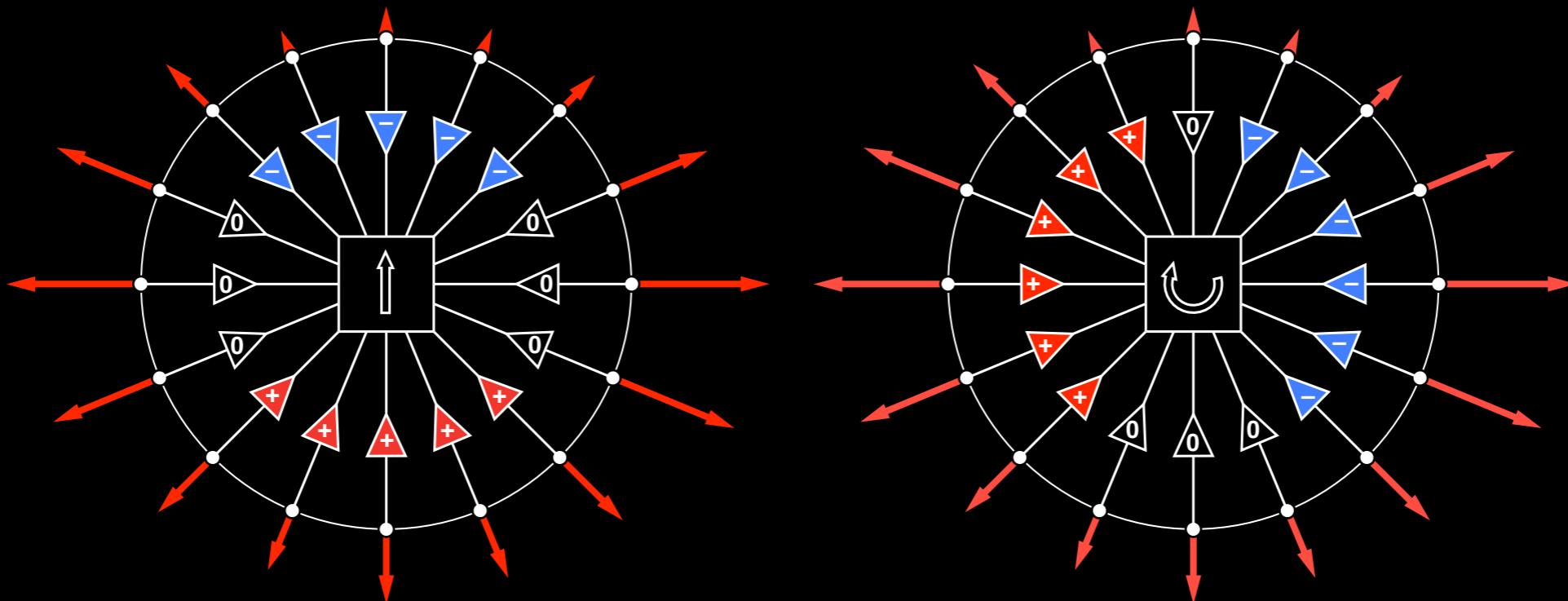


$$c = \frac{K}{N \cdot \sin \hat{\theta}} \sum_{k=0}^{N-1} p_T(\hat{\theta}, k \cdot \hat{\psi}) \cdot w_k$$

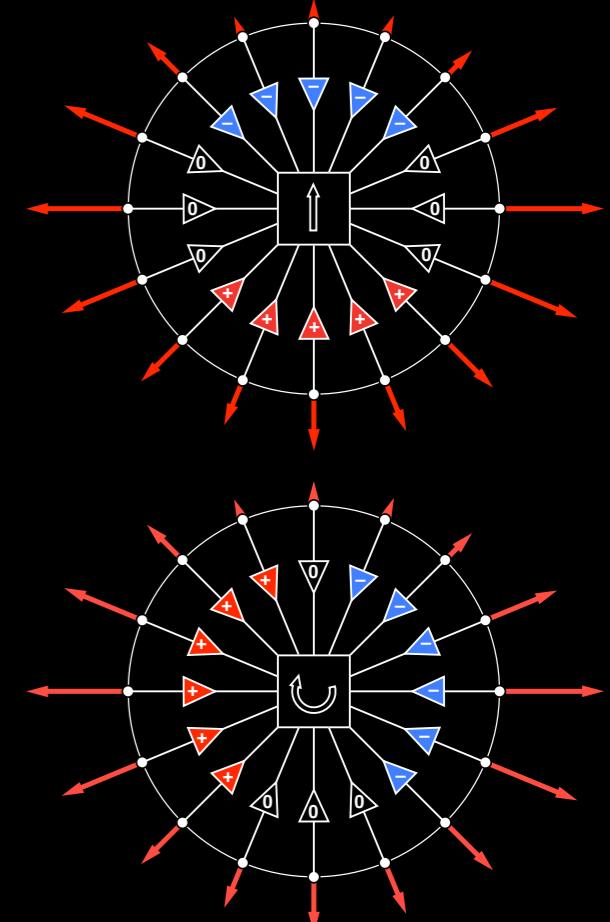
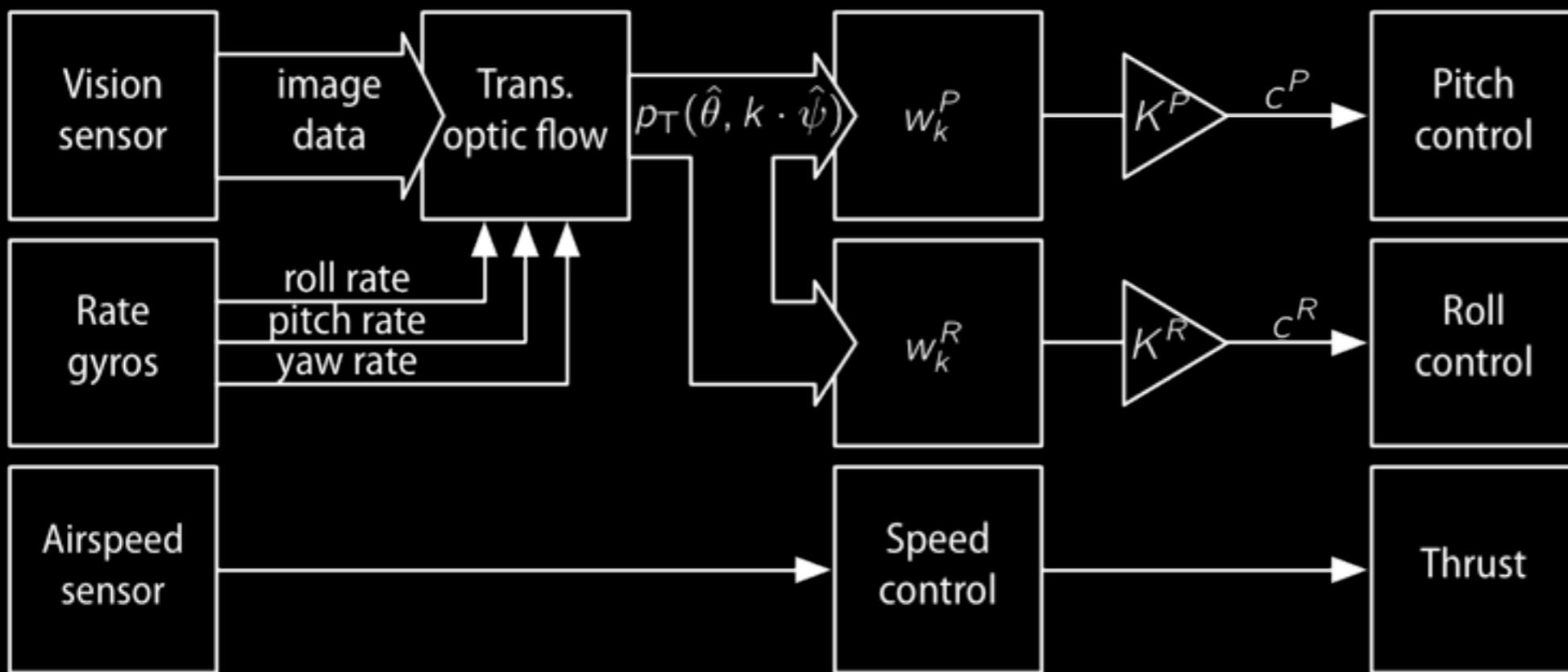


Beyeler, A., Zufferey, J.-C. and Floreano, D. Vision-based control of near-obstacle flight.  
*Autonomous Robots*, 2009.

# Weight distributions

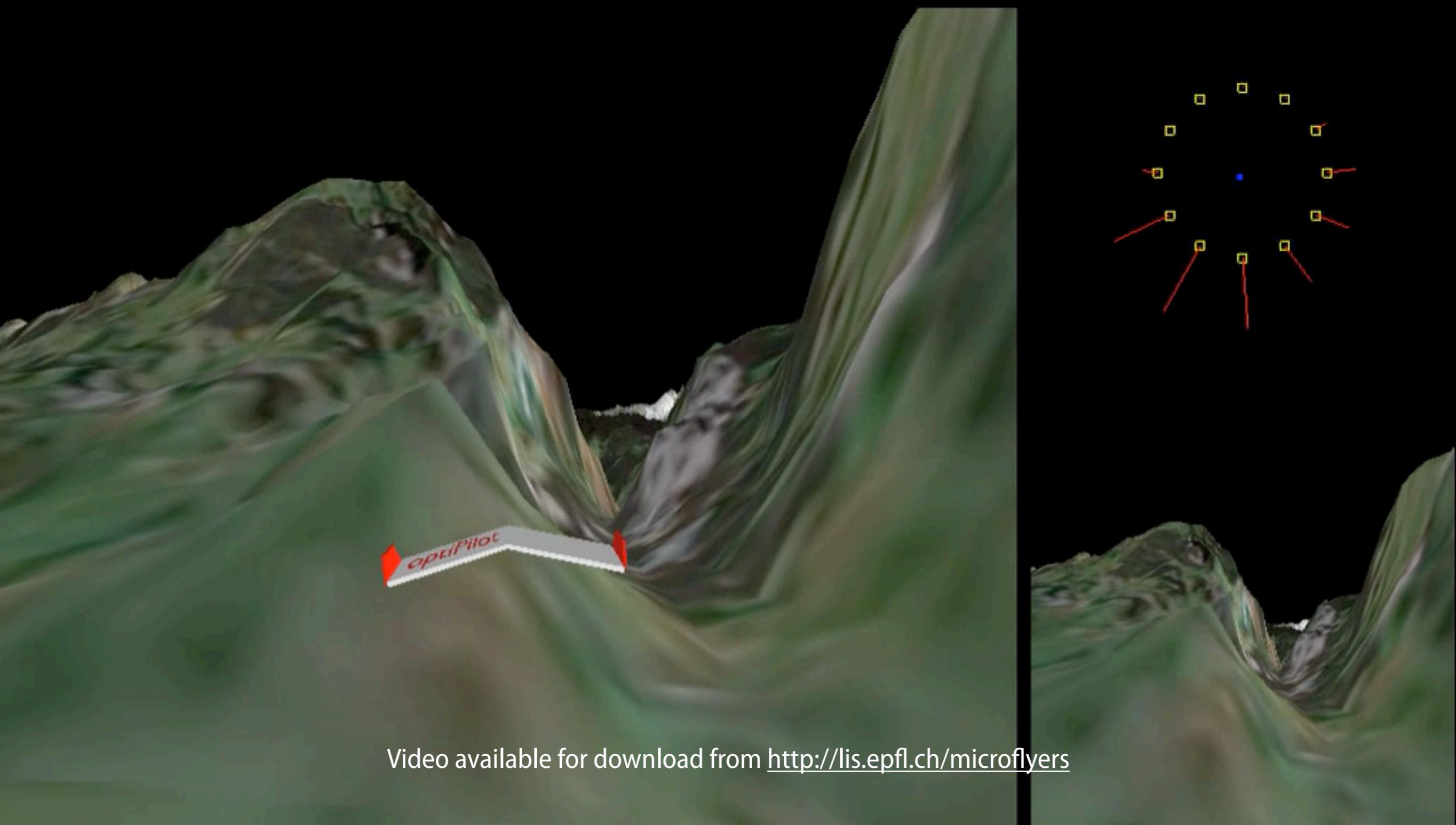


# Control architecture



Beyeler, A., Zufferey, J.-C. and Floreano, D. Vision-based control of near-obstacle flight.  
*Autonomous Robots*, 2009.

# *optiPilot à la montagne*



# *optiPilot à la ville*



Video available for download from <http://lis.epfl.ch/microflyers>

# *optiPilot properties*

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Collision avoidance

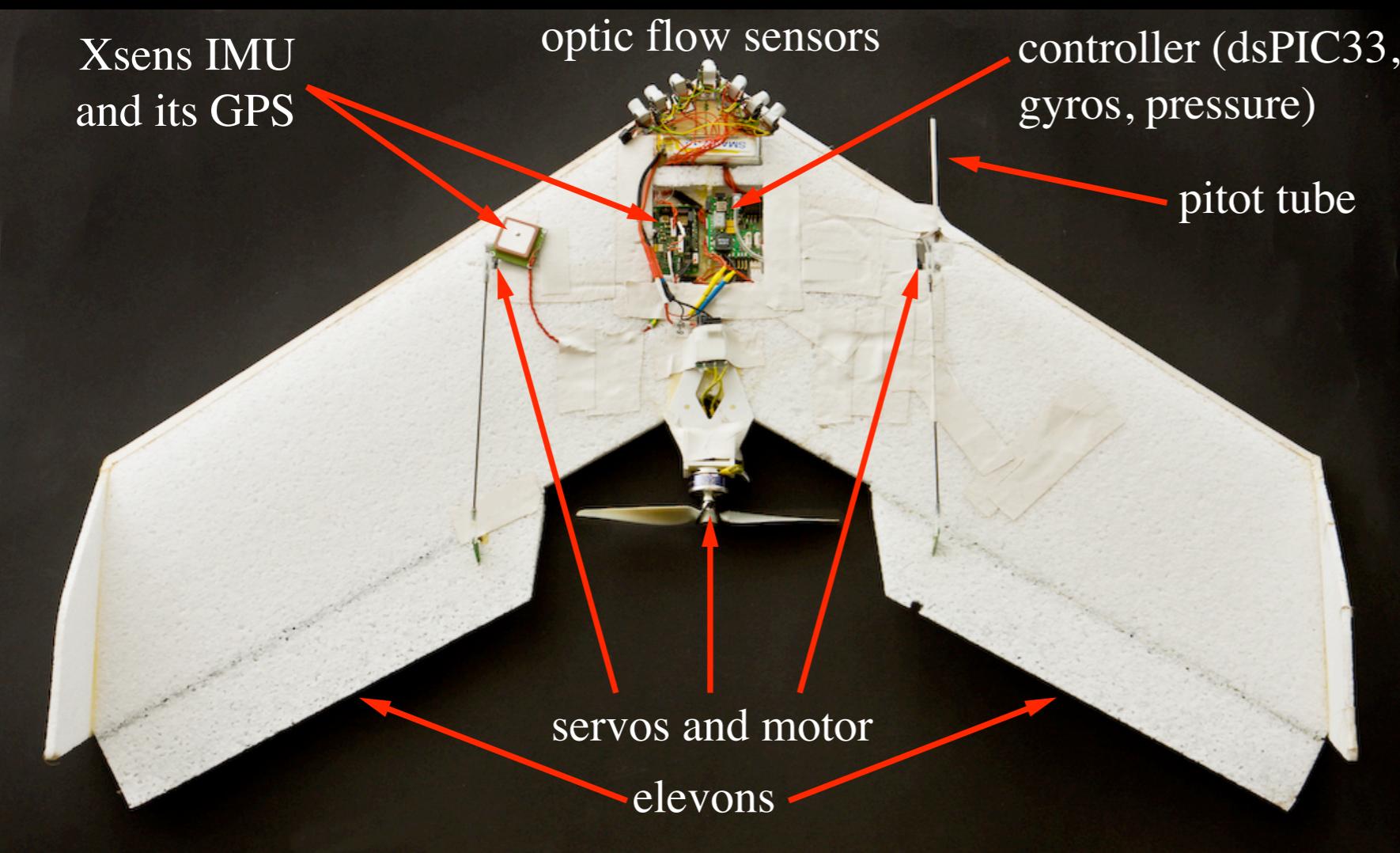
Roll & pitch stabilization

Altitude control & terrain following

Take-off & landing

Coupling with higher-level control  
strategies (e.g. GPS navigation)

# Test-bed



Avago ADNS5050  
19x19 pixels  
4500 fps  
Modified lenses: 4.5-9 ° FOV

Beyeler, A., Zufferey, J.-C. and Floreano, D. Vision-based control of near-obstacle flight.  
*Autonomous Robots*, 2009.

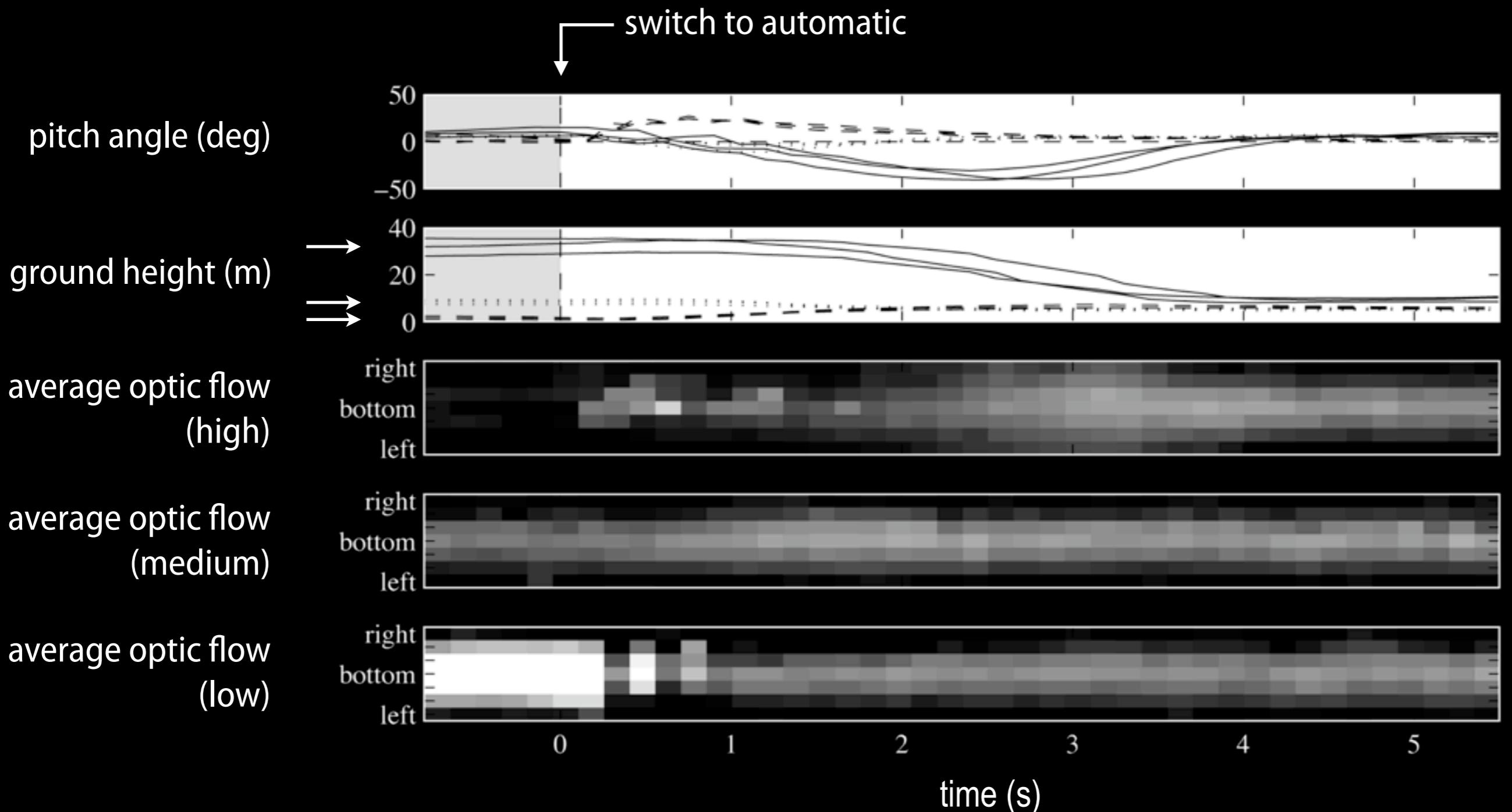
# *Terrain following*

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Video available for download from <http://lis.epfl.ch/microflyers>

# *Altitude regulation*

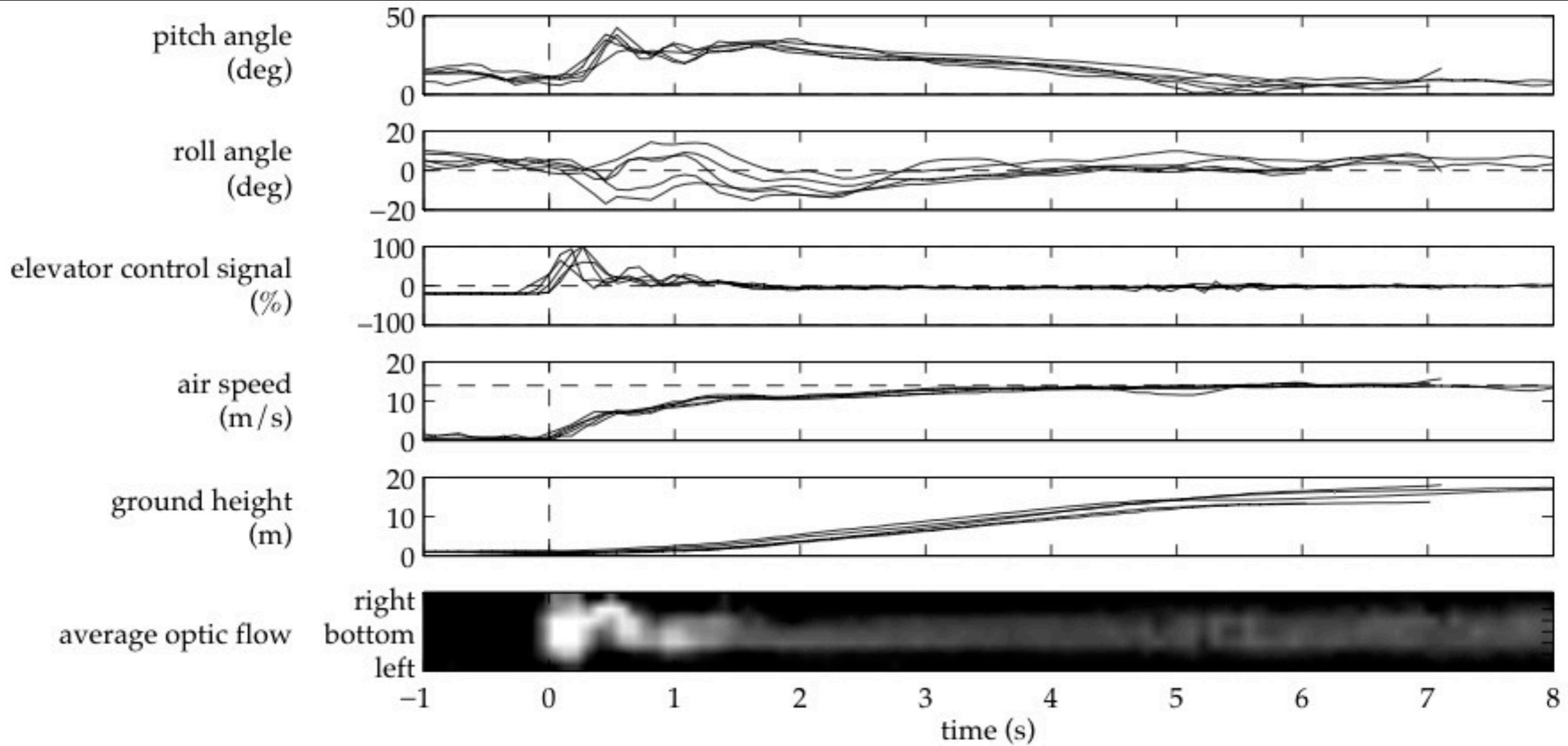


# *Autonomous take-off*



Video available for download from <http://lis.epfl.ch/microflyers>

# *Take off*



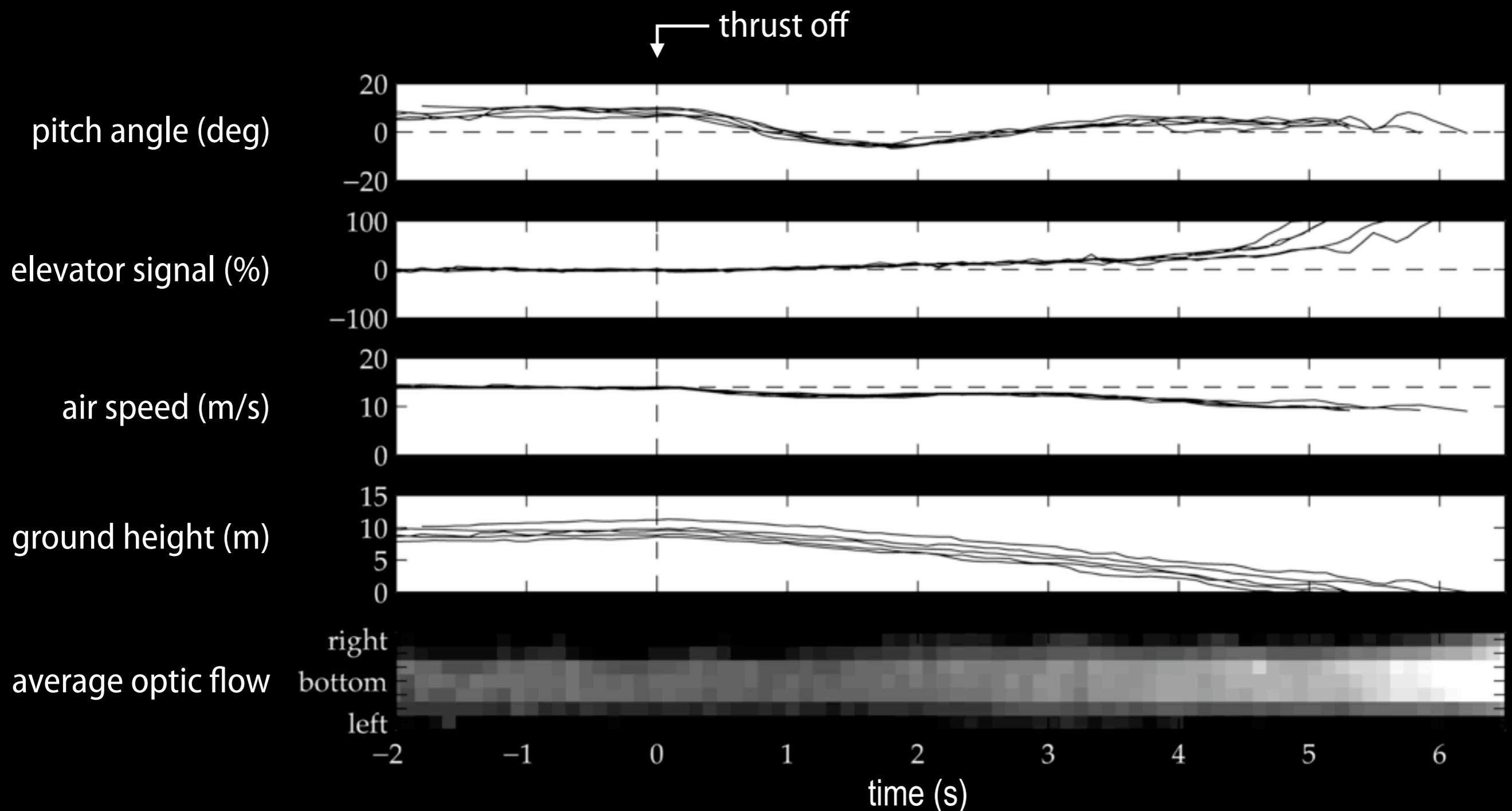
# *Autonomous landing*

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Video available for download from <http://lis.epfl.ch/microflyers>

# Landing



Beyeler, A., Zufferey, J.-C. and Floreano, D. OptiPilot: control of take-off and landing using optic flow.

*Proceedings of the European Micro Air Vehicle conference and competition (EMAV), 2009.*

# *Rejection of perturbations*

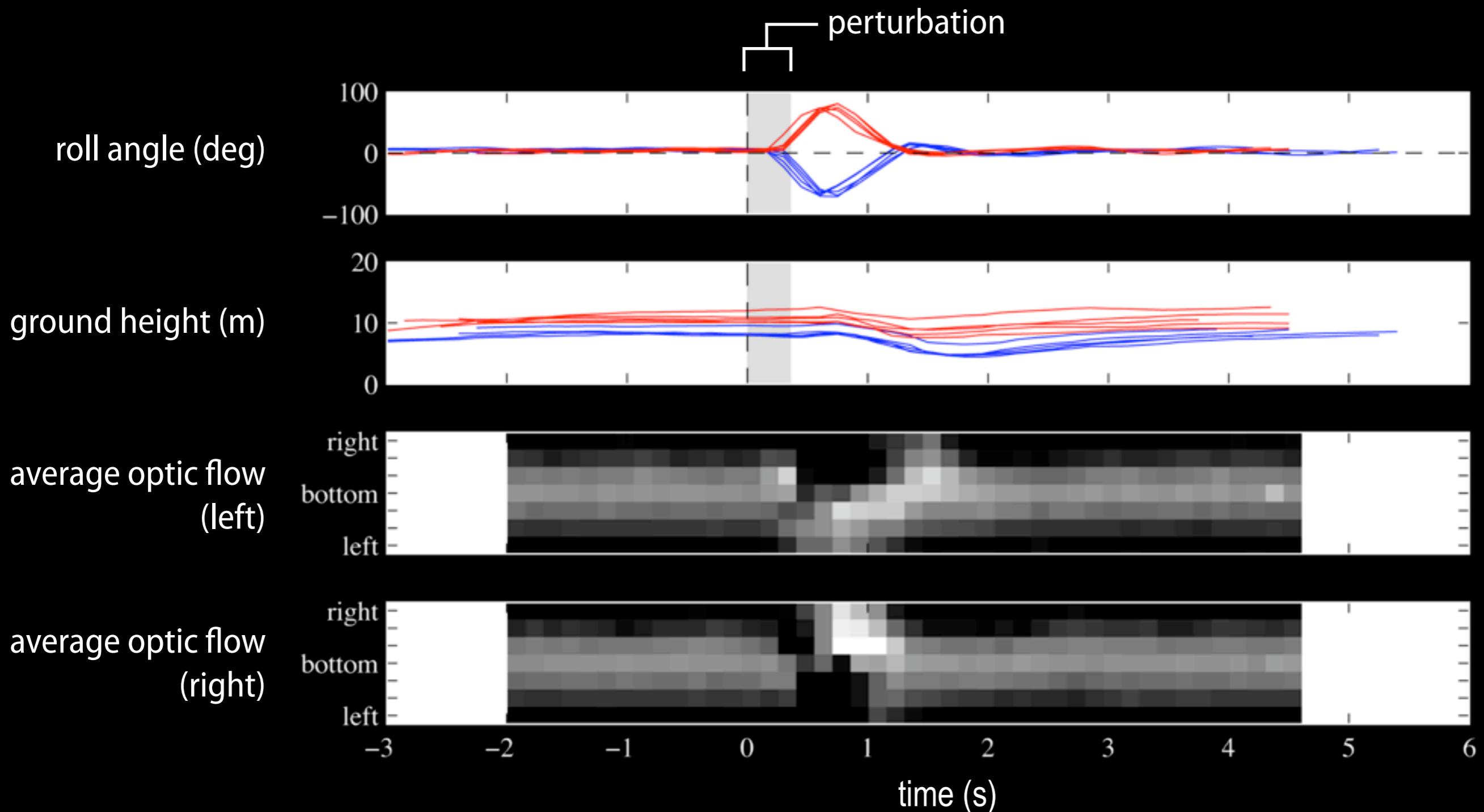
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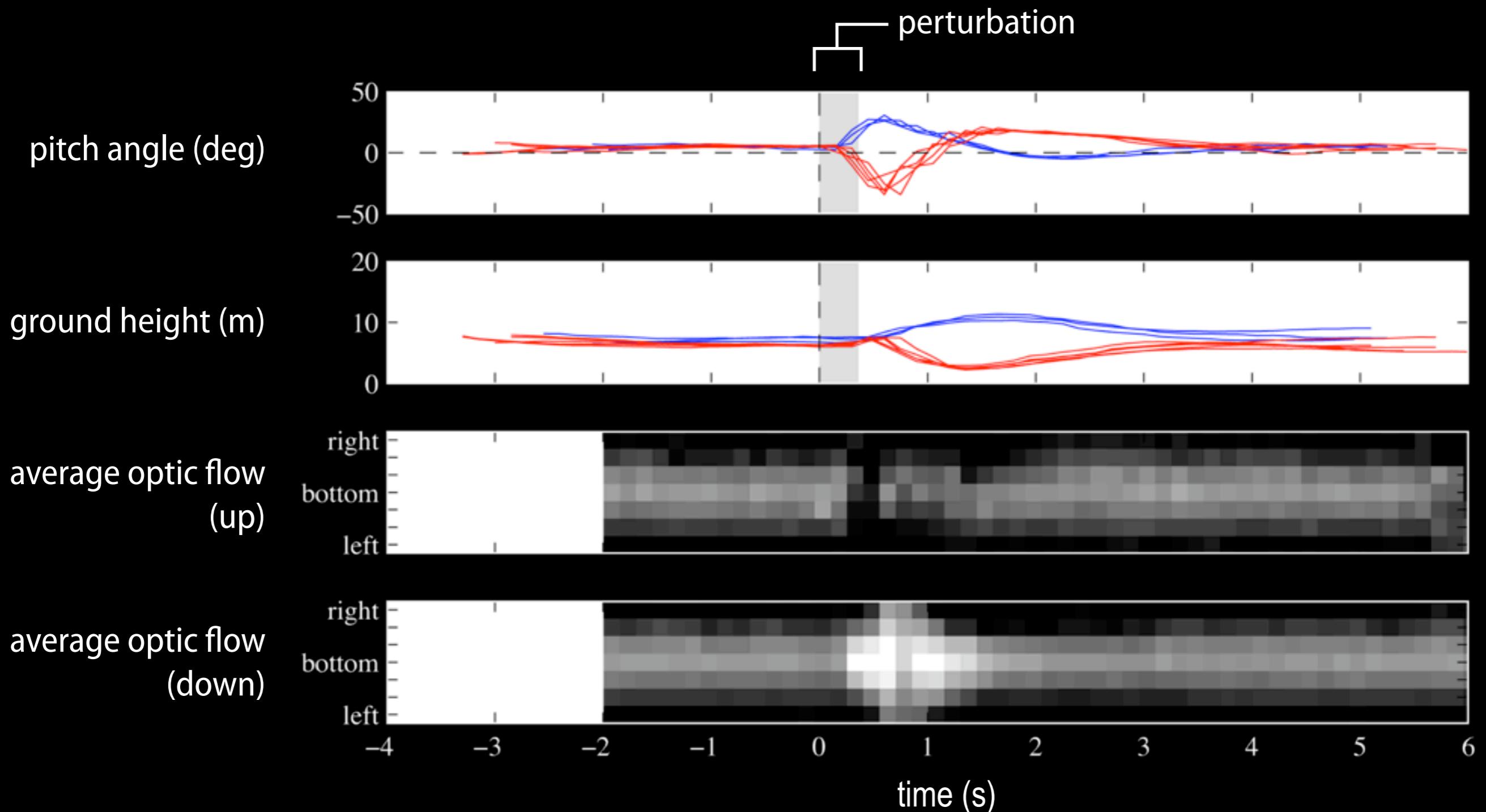
## level flight

Video available for download from <http://lis.epfl.ch/microflyers>

# *Roll regulation*

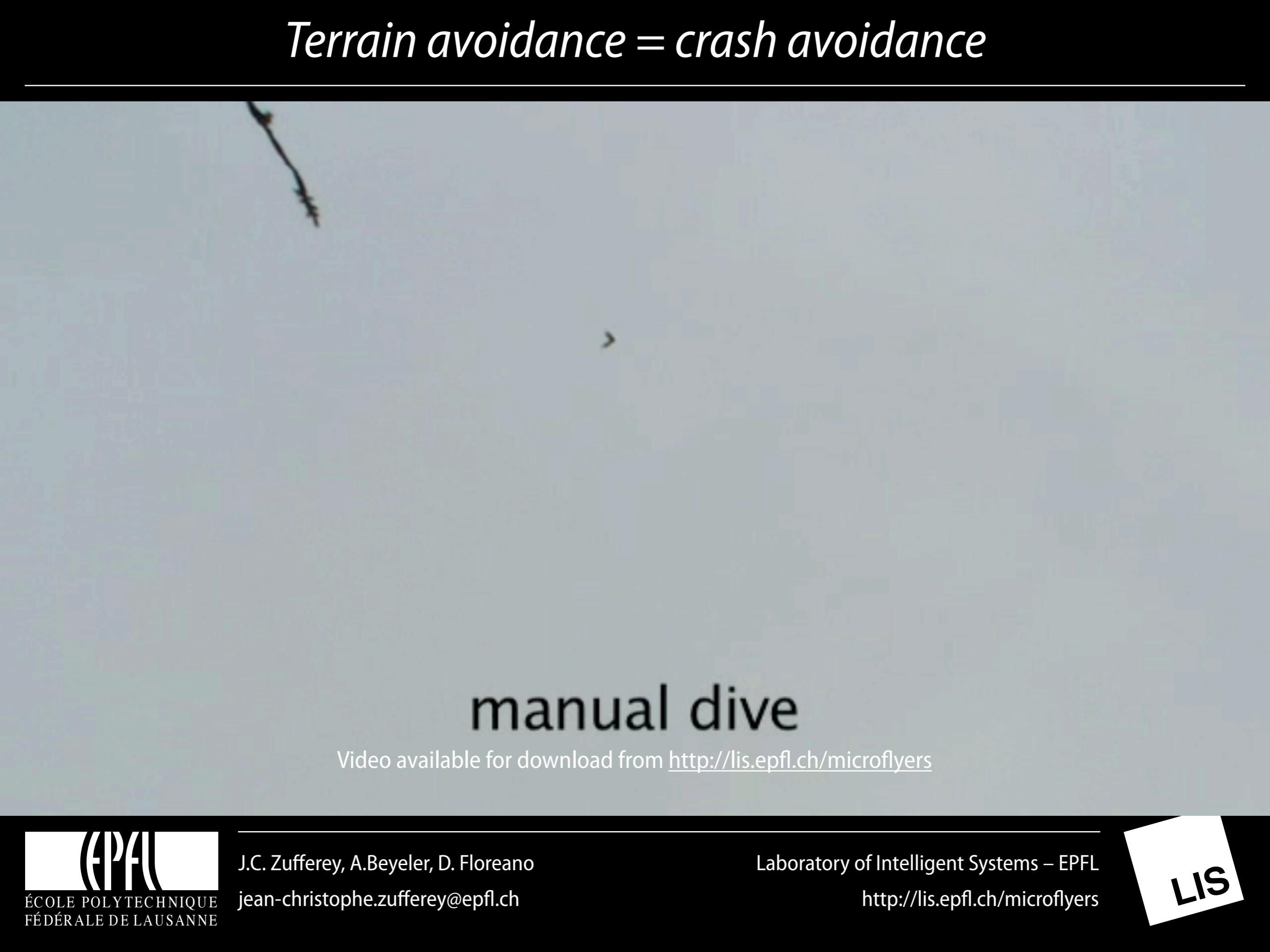


# *Pitch stabilisation*



*Terrain avoidance = crash avoidance*

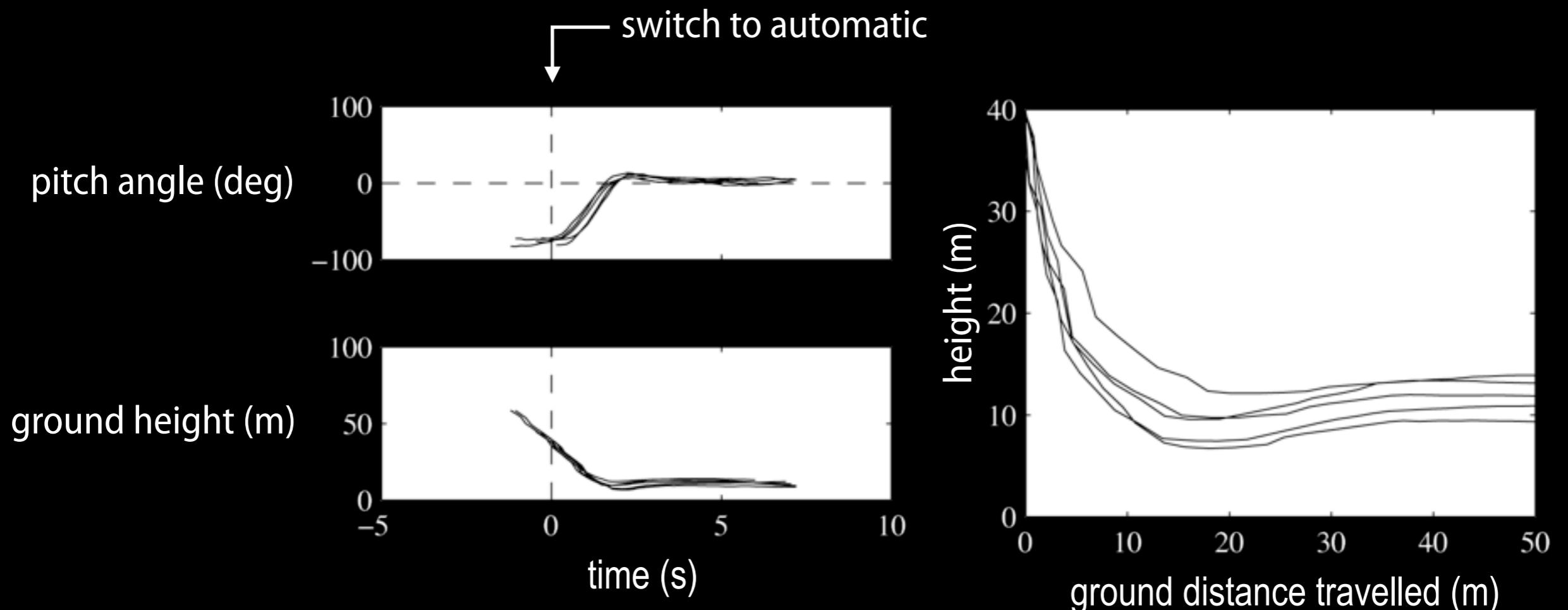
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## manual dive

Video available for download from <http://lis.epfl.ch/microflyers>

# *Recovery from vertical dive*

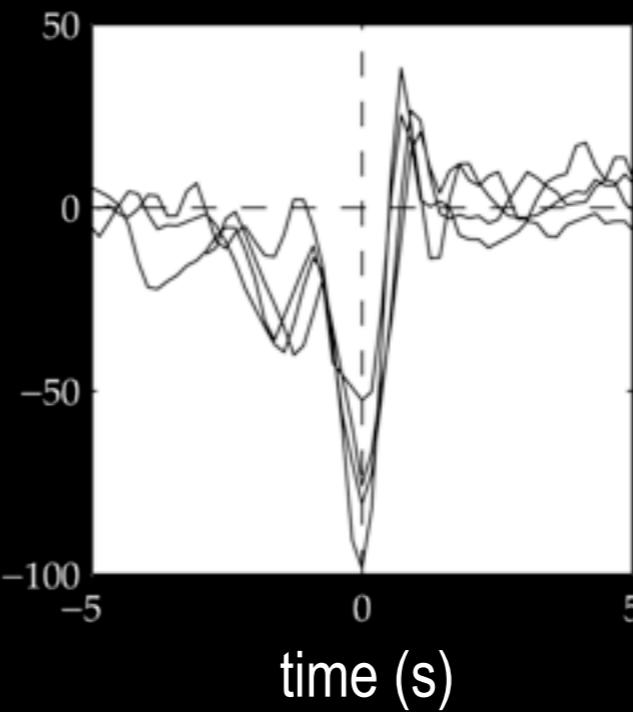
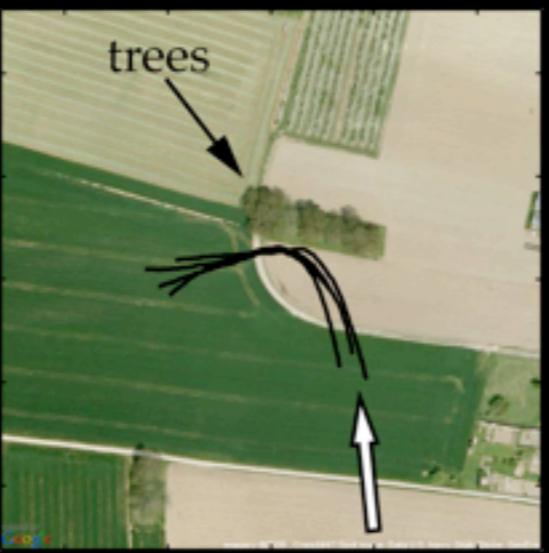
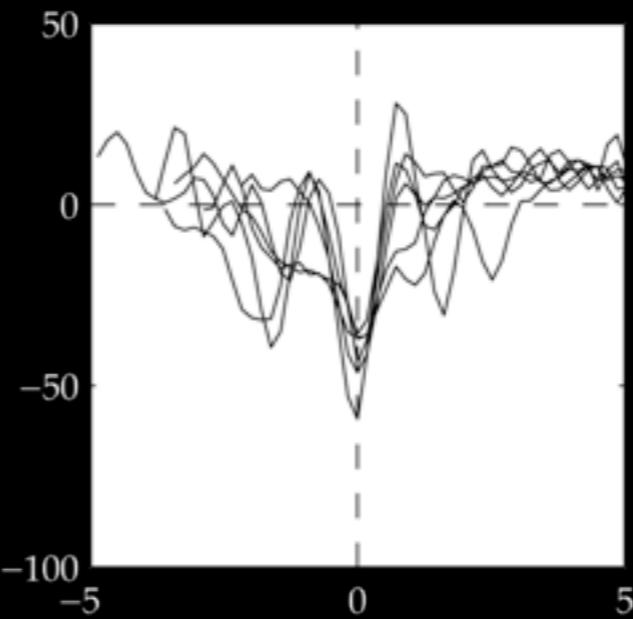


# *Obstacle avoidance*

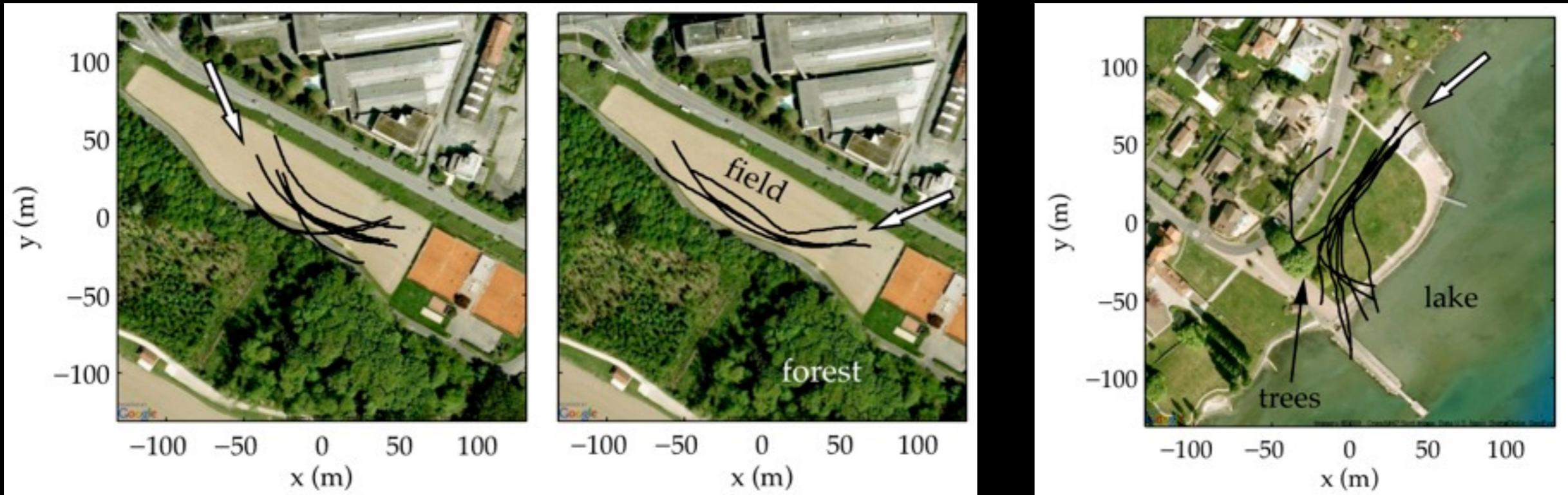
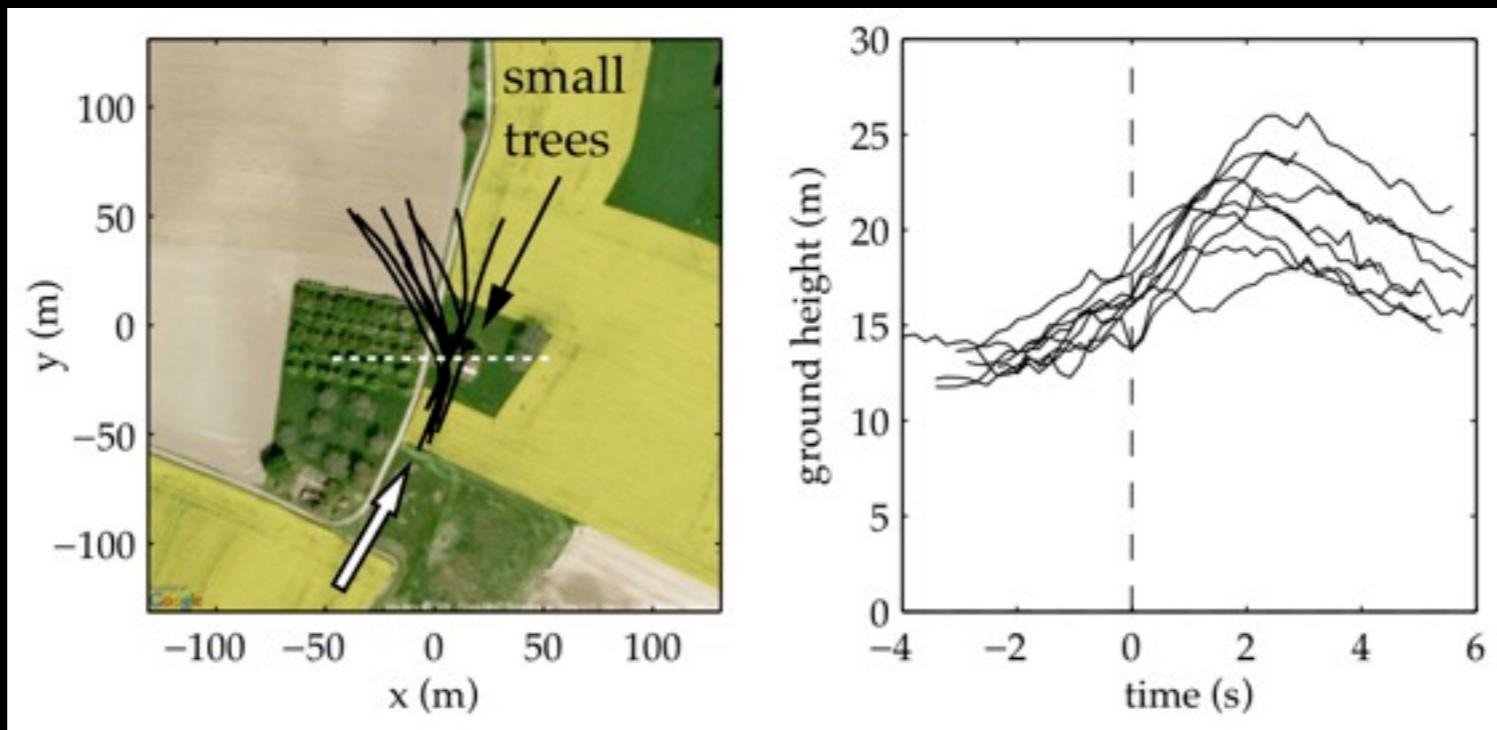


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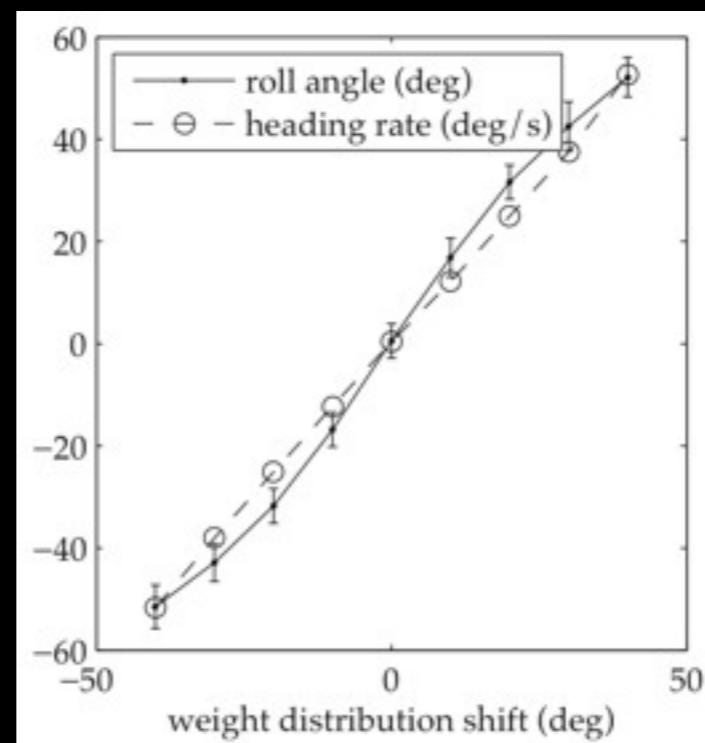
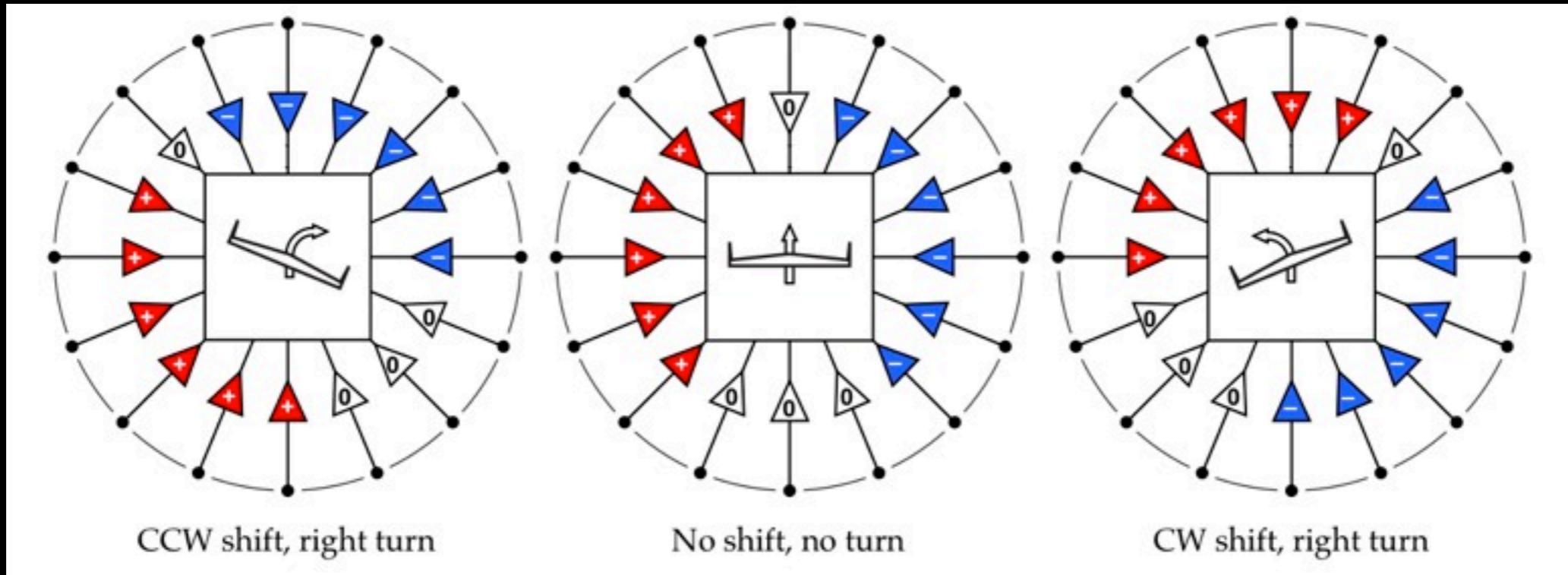
# *Obstacle avoidance*



# Obstacle avoidance



# Steering control



# Coupling optiPilot with GPS

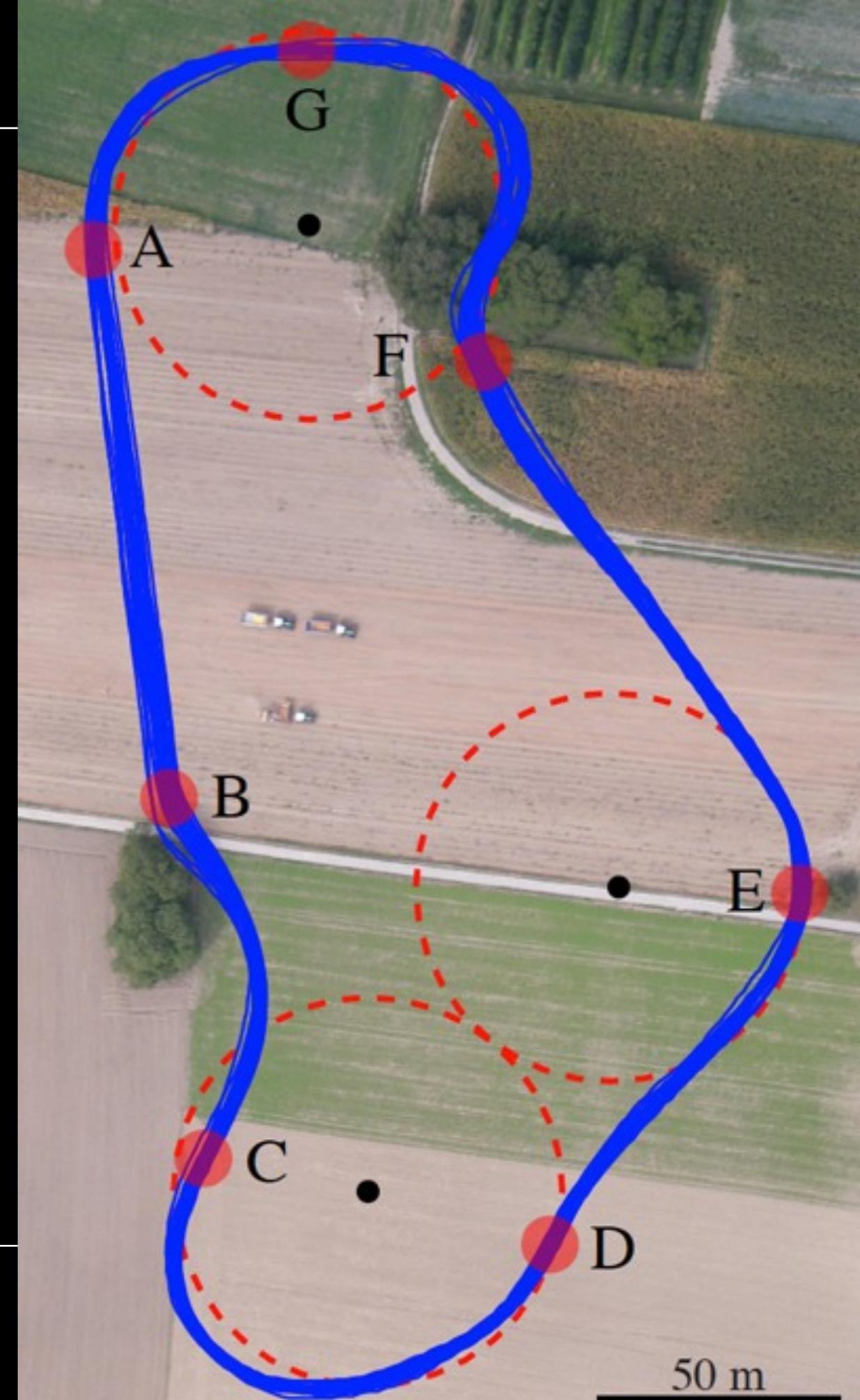
- Terrain following & collision avoidance = optiPilot
- Path following through optiPilot weight shifting

Beyeler, A., Zufferey, J.-C. and Floreano, D.

Autonomous flight at low altitude

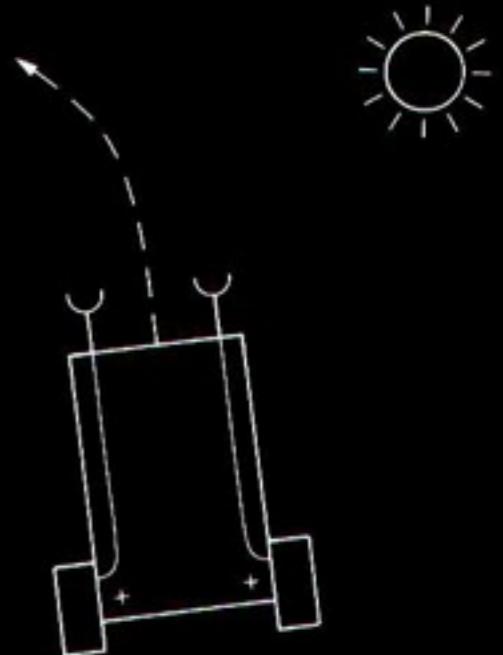
with vision-based collision avoidance and GPS-based path following

*Submitted to ICRA 2010*



# Conclusion

- Fully autonomous flight without GPS+IMU
- Complete flight control emerges from 3D collision avoidance
- Very parsimonious overall design (<1ms on dsPIC)
- Future work:
  - » higher-resolution optic-flow detection
  - » test in man-made environments



Braitenberg, 1984

# *Acknowledgements*

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Adrien Briod

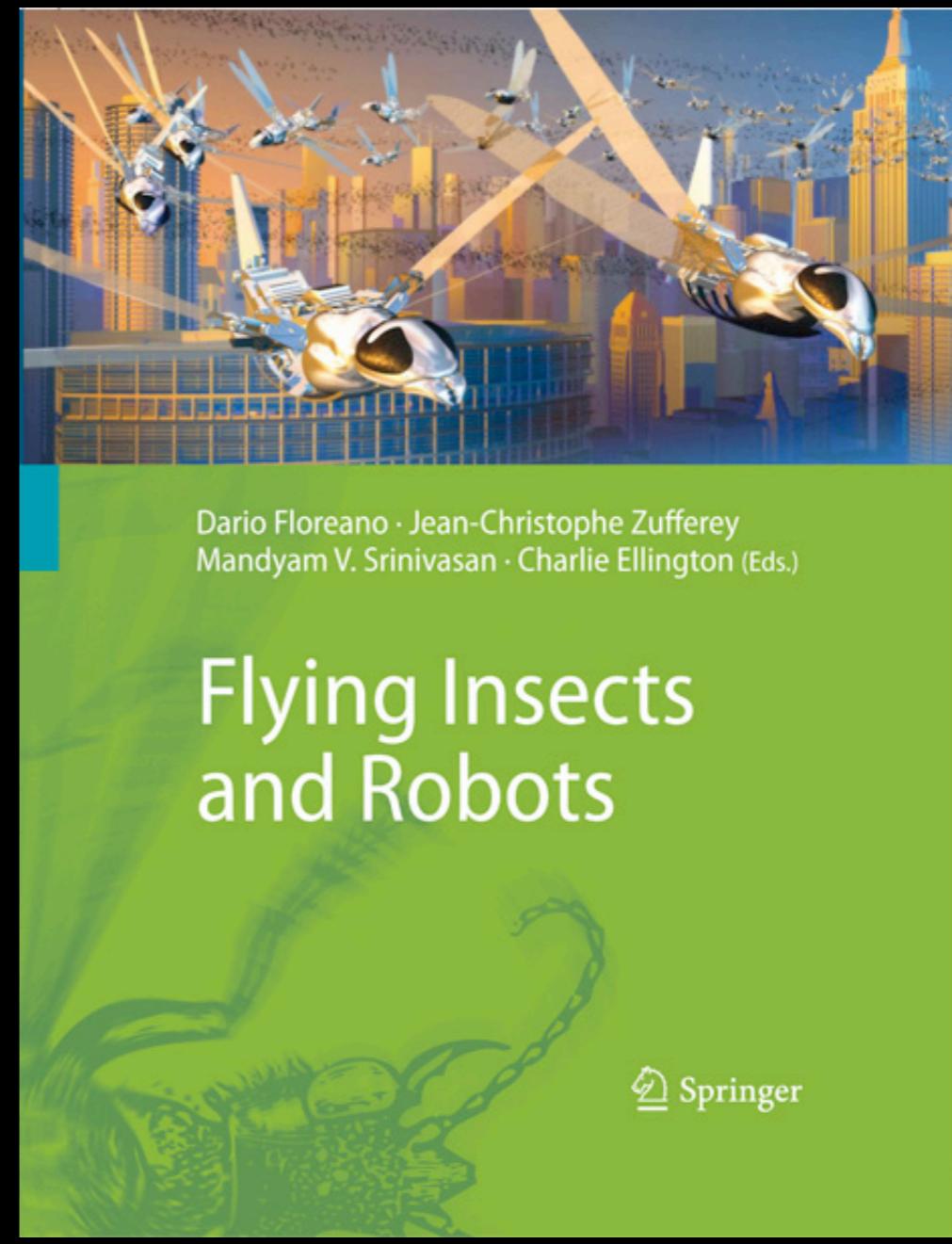
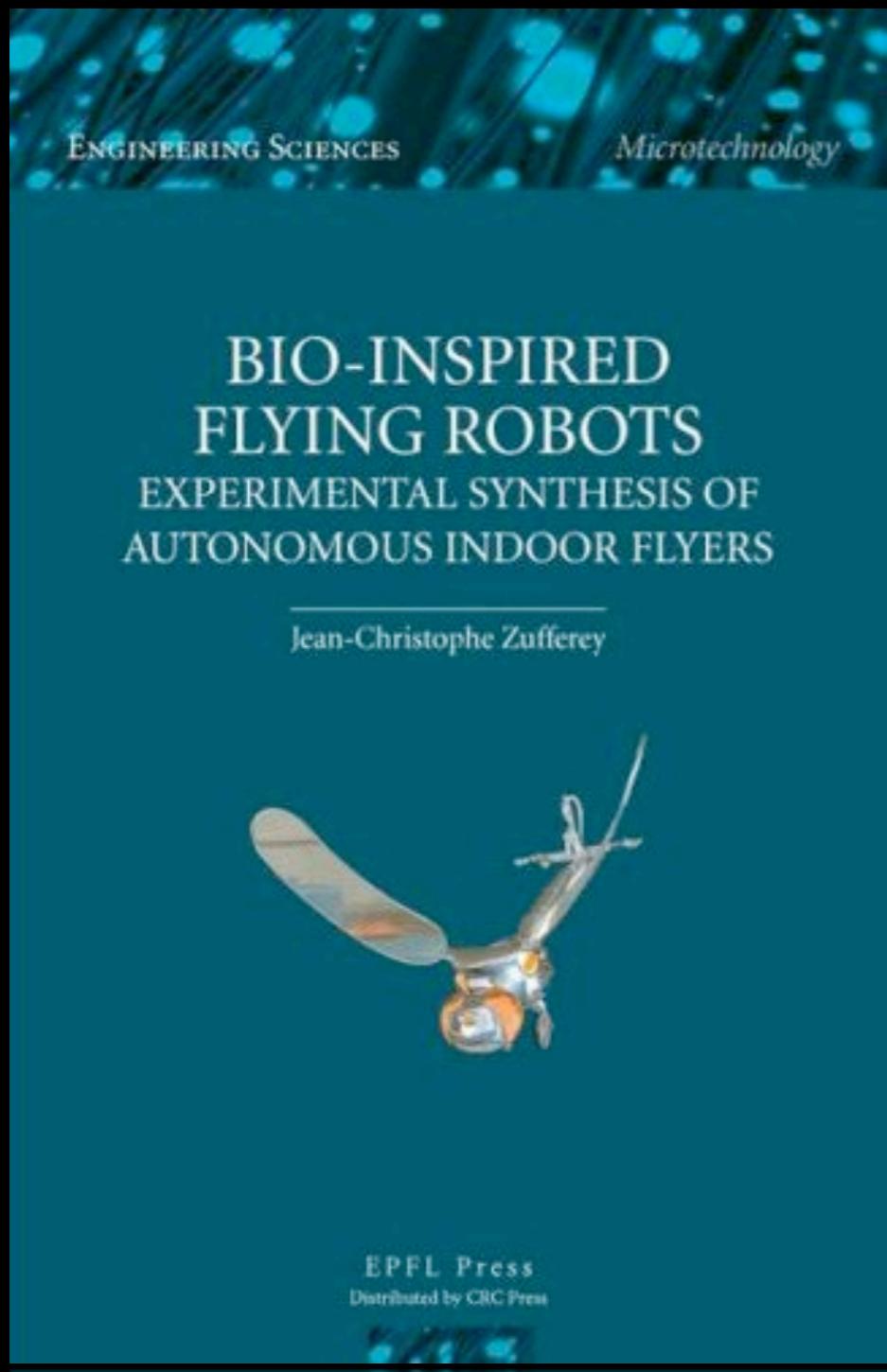
Laurent Coutard

André Guignard

Severin Leven



grants 200021-105545/1  
& 200020-116149



# senseFly



- Fully autonomous (GPS+IMU+pressure)
- EPP foam => safe & crash resistant
- Max 500 g including 150 g payload
- Cross-platform software

[www.sensefly.com](http://www.sensefly.com)