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Aerial Object Tracking from an Airborne Platform

Author: Andreas Nussberger
Presented by: Daniel Ambühl
Sept. 11, 2017

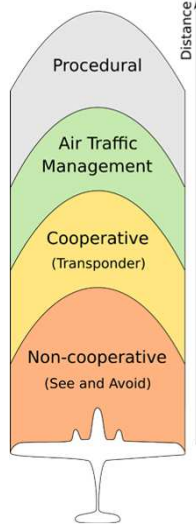
ICAS Workshop 2017, Winterthur, Switzerland

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Motivation

- **Goal:** integrate «Remotely Piloted Aircraft Systems» into civil airspace
- **Challenge:** replace pilot «See & Avoid» capability by a technical system

→ **Sense & Avoid / Detect & Avoid**

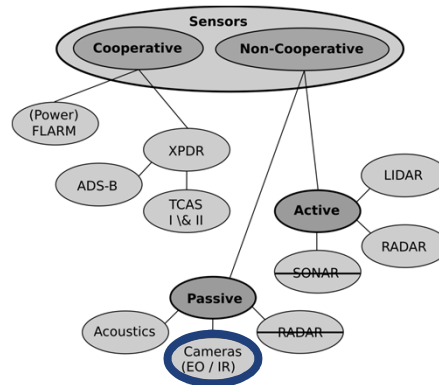


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How to Detect Aerial Objects?

- «**Cooperative Traffic**»
 - Transponders, ADS-B, FLARM, TCAS, ...
 - Required or optional depending on aircraft type, airspace, etc

- «**Non-cooperative Traffic**»
 - Cameras (EO, IR), RADAR, ...
 - Usually smaller airspace users and gliders, para-gliders, balloons



→ We focus on electro-optical sensors !

Where is the Aircraft?



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Outline

Experimental Detect and Avoid System

Dataset Recording

Aerial Object Tracking Framework

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Experimental Detect and Avoid System

Sensor Nose-pod

Pilot HMI

Recording Equipment

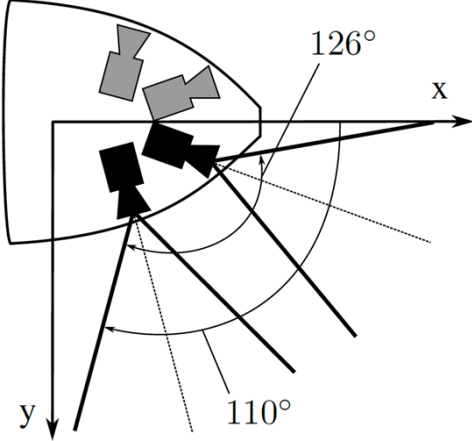
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Custom Sensor Nose-pod

- **Included Sensors**
 - ADS-B
 - FLARM
 - GPS
 - IMU
 - 2x EO cameras

- **Camera Specifications**
 - 8 Megapixel
 - Grayscale
 - 8-bit / 12-bit
 - 20 fps / 10 fps



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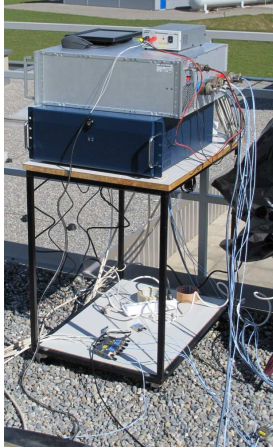
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Custom Sensor Nose-pod



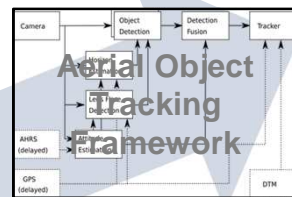
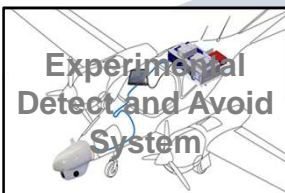

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Recording Equipment




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Outline




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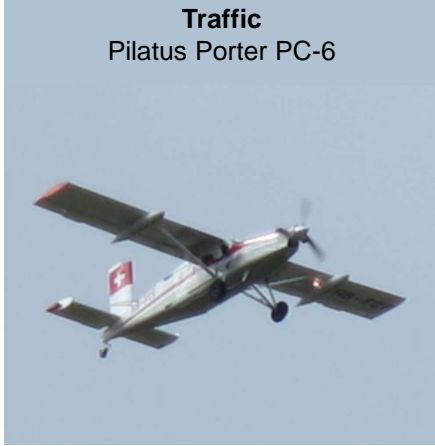
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Flight Tests


Ownship
Diamond DA-42 MPP



Traffic
Pilatus Porter PC-6



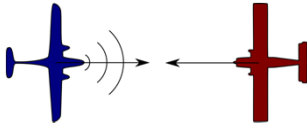
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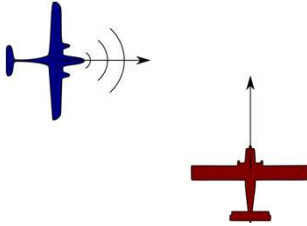
Dataset Summary

- **5h45min Total Flight Time**
- **2.2 TB of Data**
 - Cameras (8-bit / 12-bit)
 - ADS-B, FLARM
 - GPS, IMU
- **46 Scenarios**
 - 26x head-on
 - 20x crossing
 - 32x 8-bit
 - 14x 12-bit


▪ **Head-on Scenario**



▪ **Crossing Scenario**

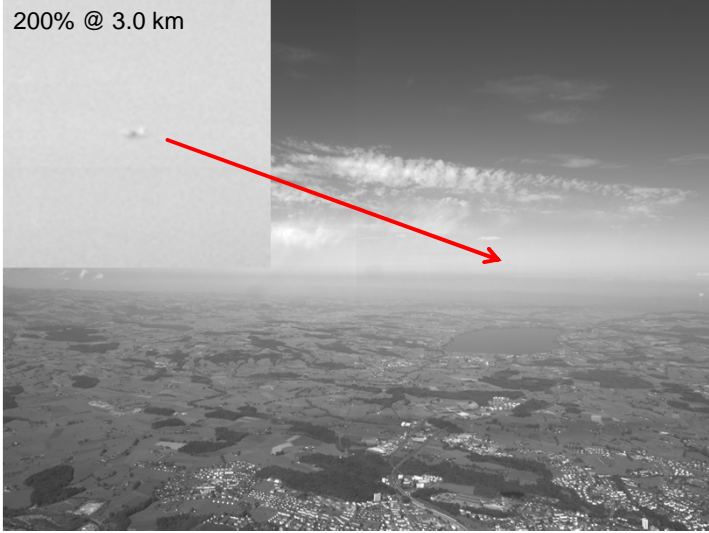


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Challenge I: Small Objects

200% @ 3.0 km



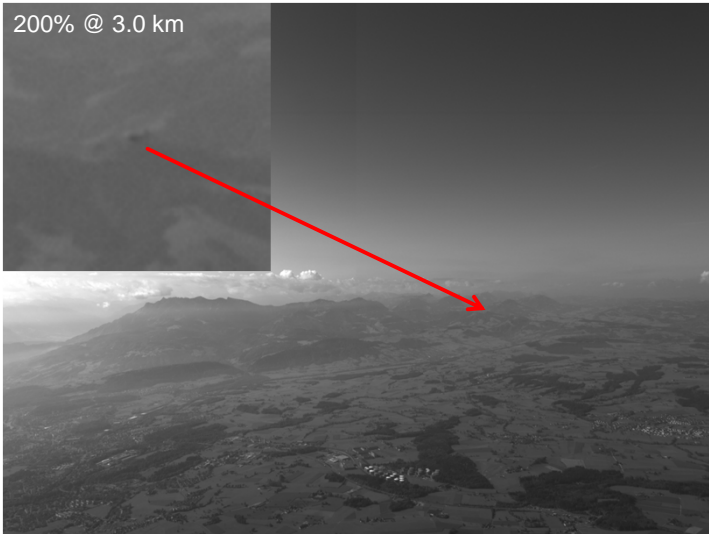
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This slide illustrates 'Challenge I: Small Objects'. It features a grayscale aerial photograph of a city. A red arrow points from a small, indistinct object in the sky to a larger, magnified inset in the top-left corner. The inset is labeled '200% @ 3.0 km' and shows a clearer view of the object, which appears to be a small, dark, rectangular shape. The main image shows a city with a large body of water in the distance.

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Challenge II: Objects in Front of Terrain

200% @ 3.0 km



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This slide illustrates 'Challenge II: Objects in Front of Terrain'. It features a grayscale aerial photograph of a mountainous region. A red arrow points from a small, indistinct object in the sky to a larger, magnified inset in the top-left corner. The inset is labeled '200% @ 3.0 km' and shows a clearer view of the object, which appears to be a small, dark, rectangular shape. The main image shows a mountainous terrain with a valley in the foreground.

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Challenge III: Ownship Egomotion

t = 0s t = 1s
t = 2s t = 3s

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Challenge IV: Environmental Conditions

Lens Flares !!!

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Outline

Experimental
Detect and Avoid
System

Dataset
Recording

Aerial Object
Tracking
Framework

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Processing Framework

```

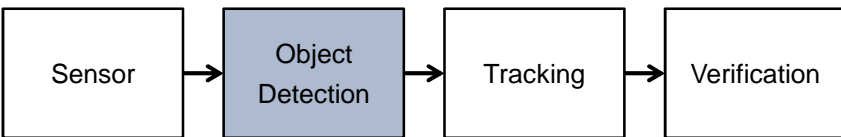
    graph LR
      A[Sensor] --> B[Object Detection]
      B --> C[Tracking]
      C --> D[Verification]
    
```

A. Nussberger, H. Grabner, L. Van Gool
 «Aerial Object Tracking from an Airborne Platform»
 In Proceedings of International Conference on Unmanned Aircraft Systems, 2014

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Processing Framework: Object Detection




```


    graph LR
      A[Sensor] --> B[Object Detection]
      B --> C[Tracking]
      C --> D[Verification]
      style B fill:#d9e1f2
    
```

- ↳ **Morphological filtering**
 R. Carnie, R. Walker and P. Corke
 «Image processing algorithms for UAV sense and avoid»
 In Proceedings of International Conference on Robotics and Automation, 2006
- ↳ **Image differencing**
 I. Saleemi and M. Shah
 «Multiframe many-many point correspondence for vehicle tracking in high density wide area aerial videos»
 International Journal of Computer Vision, 2013

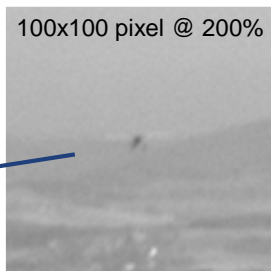
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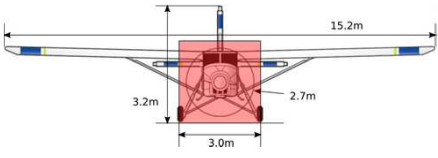
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PC-6 Initial Detection during Headon

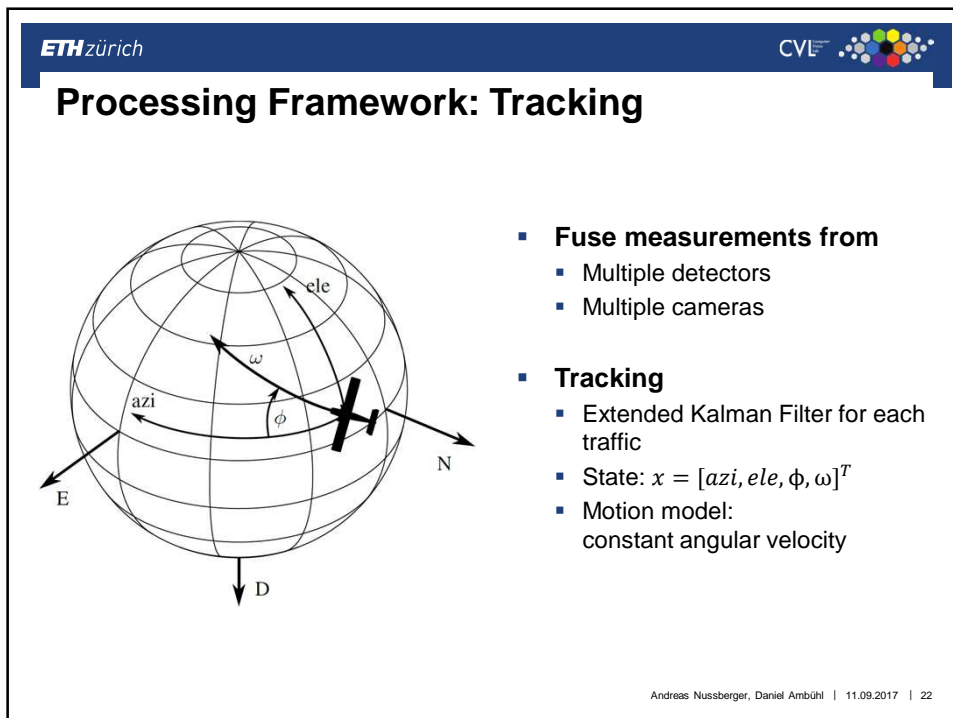
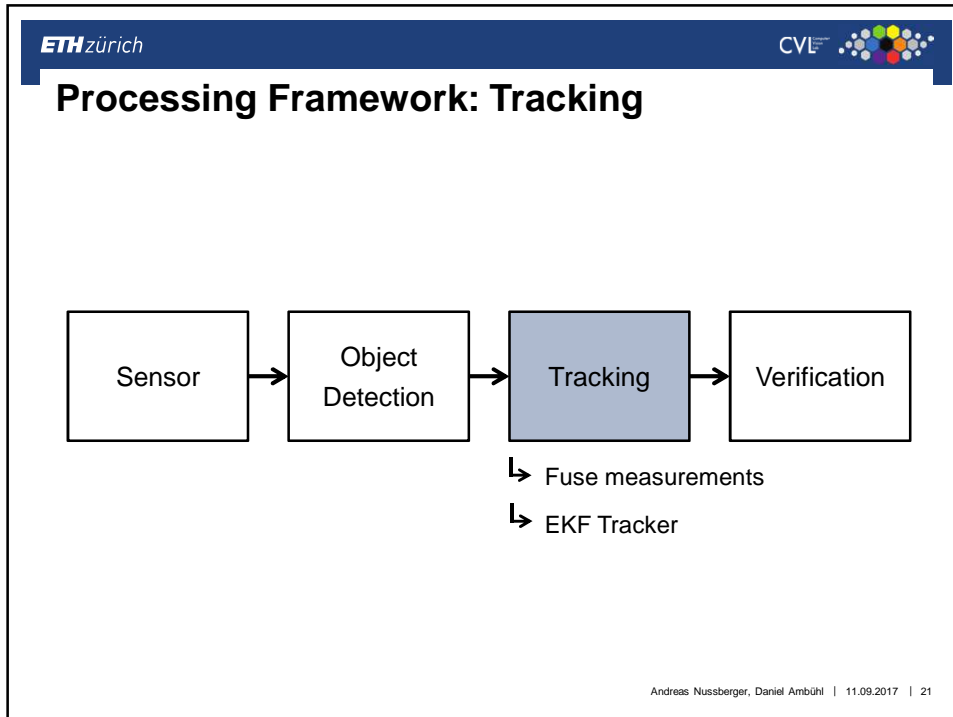


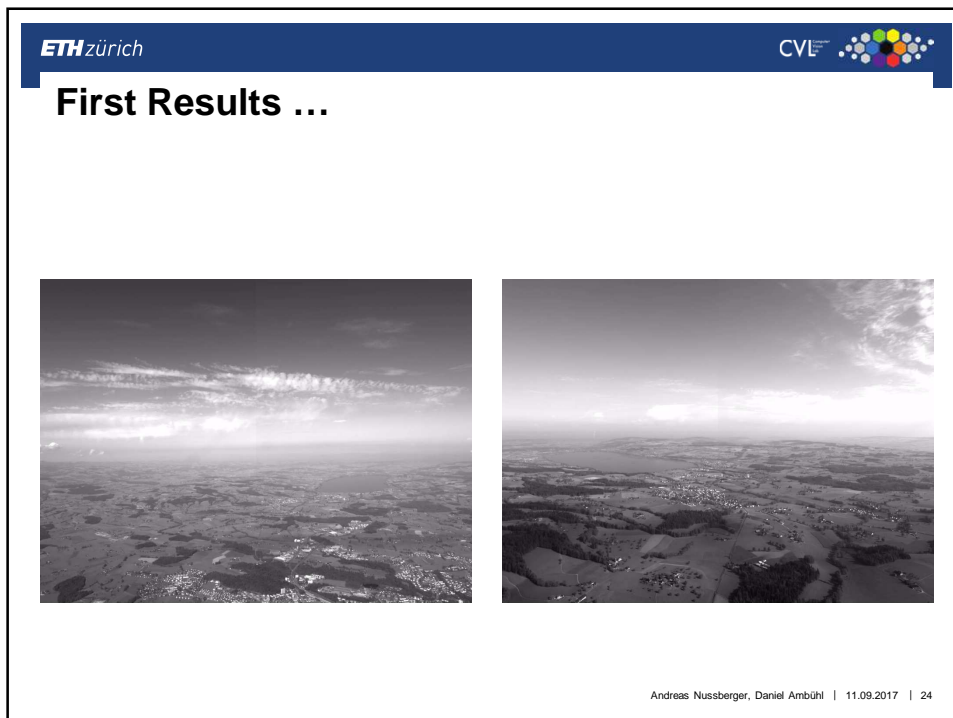
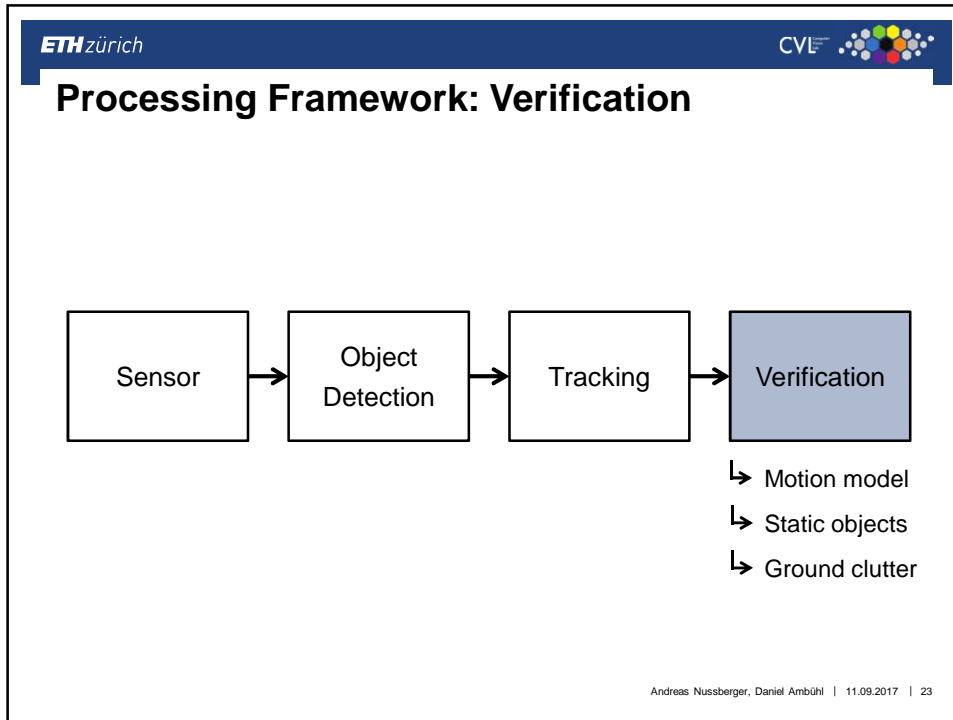
100x100 pixel @ 200%






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False Tracks from Lens Flares

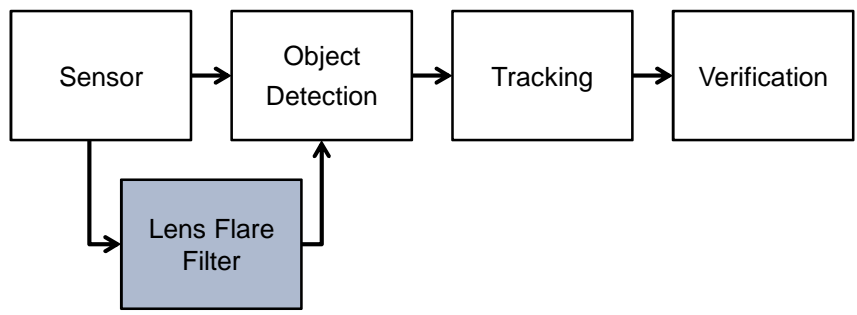


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Processing Framework: Extension II

A. Nussberger, H. Grabner, L. Van Gool
«Robust Aerial Object Tracking in Images with Lens Flares»
 In Proceedings of International Conference on Robotics and Automation, 2015



```

    graph LR
      Sensor[Sensor] --> OD[Object Detection]
      OD --> Tracking[Tracking]
      Tracking --> Verification[Verification]
      LF[Lens Flare Filter] --> Sensor
      LF --> OD
    
```

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Identifying Lens Flares in Camera Images

Required meta data: date, time, position and attitude of camera


Navigation frame Body frame Camera frame

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Identifying Lens Flares in Camera Images


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Results with Lens Flare Filter




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Overall Results



	Scenario Details (Note: LF = Lens Flare)			Default Parameters			Modified Parameters		
	Type	Background	Duration	Valid Track		FT	Valid Track		FT
				Distance	TTC	Num.	Distance	TTC	Num.
A	Head-on	Sky	26.2 s	1874 m	17.6 s	1	2177 m	19.6 s	0
B	Head-on	Sky	24.0 s	1622 m	14.5 s	0	1928 m	16.7 s	0
C	Head-on	Terrain	11.6 s	980 m	7.8 s	0	1436 m	12.3 s	0
D	Head-on	Terrain	22.4 s	1116 m	9.0 s	11	1617 m	12.9 s	0
E	Crossing	Sky	36.8 s	2830 m	35.3 s	2	2837 m	35.4 s	0
F	Crossing	Sky	48.0 s	2588 m	42.2 s	0	2680 m	45.3 s	0
G	Crossing	Sky	29.5 s	1831 m	17.7 s	2	2100 m	22.4 s	0
H	Crossing (LF)	Terrain	23.3 s	1637 m	15.2 s	1	2272 m	24.2 s	2
I	Crossing	Terrain	30.2 s	1489 m	14.0 s	2	2153 m	22.1 s	0
K	Crossing	Terrain	37.8 s	1593 m	23.4 s	4	2284 m	33.5 s	2
L	Crossing (LF)	Terrain	41.2 s	2884 m	39.6 s	0	2085 m	29.0 s	2
M	Head-on (LF)	Terrain	25.3 s	1419 m	11.0 s	0	1618 m	13.7 s	1
N	Wingrock	Sky	25.2 s	1932 m	16.0 s	0	1998 m	16.8 s	0
O	Wingrock	Terrain	26.4 s	1730 m	15.3 s	0	1497 m	13.1 s	0
P	Wingrock	Sky	26.3 s	1908 m	17.9 s	0	1788 m	15.7 s	0
Q	Wingrock (LF)	Terrain	25.8 s	921 m	9.1 s	2	897 m	7.6 s	2
Average	-	-	28.8 s	1777 m	19.1 s	2	1960 m	19.6 s	1

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Outlook: Extended Dataset Overview


- **More Scenarios**
 - > 100 scenarios
 - > 20h flight time
- **Environmental Data**
 - Lakes, roads, valleys, etc
 - > 50h flight time
- **Additional traffic types**
 - Glider
 - Paraglider
 - ...



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Outlook: Extended Dataset Example



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Discussion

