

Determination and Visualization of Uncertainties in 4D-Trajectory Prediction

Paul Weitz, German Aerospace Center (DLR)



ICNS
CONFERENCE



Knowledge for Tomorrow

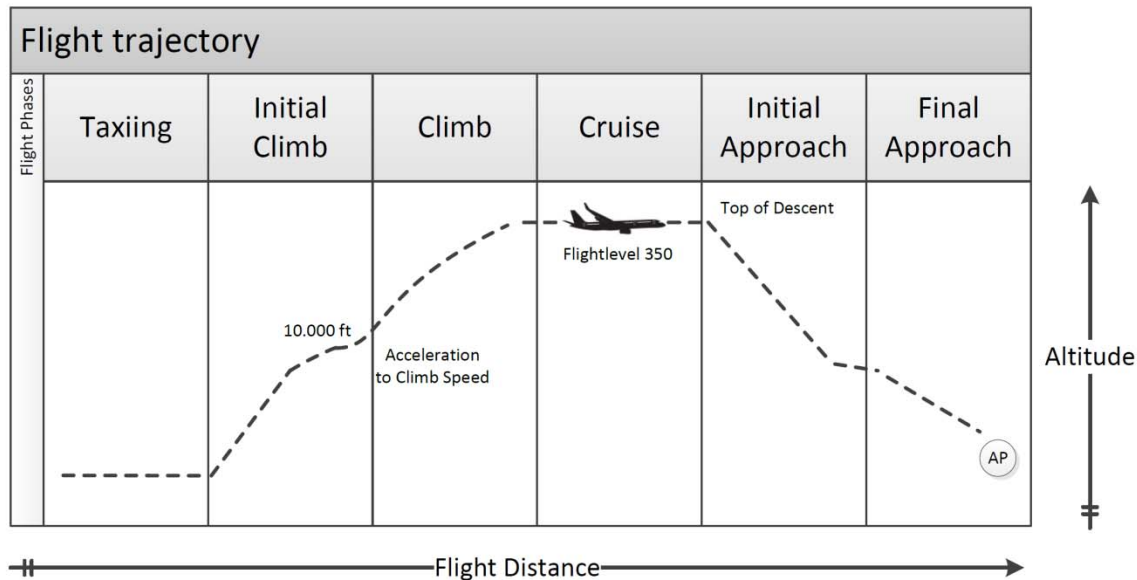
Agenda

- Motivation and Problem
- Fundamentals
- Concept
Simulation, Metrics, Data Model
- Results
- Conclusion and Future Research



Motivation I

- Increasing utilization of airspace capacity
- Predominantly at the TCA
- High separation standards in tactical ATM
- High controller workload in sectors • congestion
 - 5 % of European Flights are delayed at take off
- Approach to solution: 4D-Trajectories



[based on Craig Wanke et. al: Modeling Traffic Prediction Uncertainty for Traffic Management Decision Support]



Motivation II

- 4D-Trajectories have great potential to increase:
 - Efficiency
 - Environmental friendliness
 - Punctuality
- Optimize Route for:
 - Avoiding conflicts
 - Reduction of noise and pollutant
 - Implementation of innovative flight operations
- Supporting tools for ATM actors
- Visual analyze of airspace
- Early conflict detection and resolution



Statement of the problem

- Calculation of trajectory is based on various parameters
 - Meteorological conditions
 - Aircraft performance
- The actual value of a parameter can deviate from the forecast
- Deviation of actual from predicted trajectory
 - uncertain prediction
- Aim: Determine uncertainty before take off
 - Which accuracy of the prediction can be maintained?
 - Which area around the aircraft is influenced?

**Approach: Development of a tool
to determine, analyze and visualize the uncertainty**



Objectives

- Analysis of the contributing parameters
- Development of a metric for evaluation of trajectory uncertainties
- Preparation of fast-time simulation scenario
- Simulation of parameter variation
- Measurement of the impact on trajectory
- Implement the concept as a tool in our common reporting suite EWMS
“Extensible Workflow Management for Simulations”
- Development of a display to visualize the uncertainties in a quantitative and qualitative way

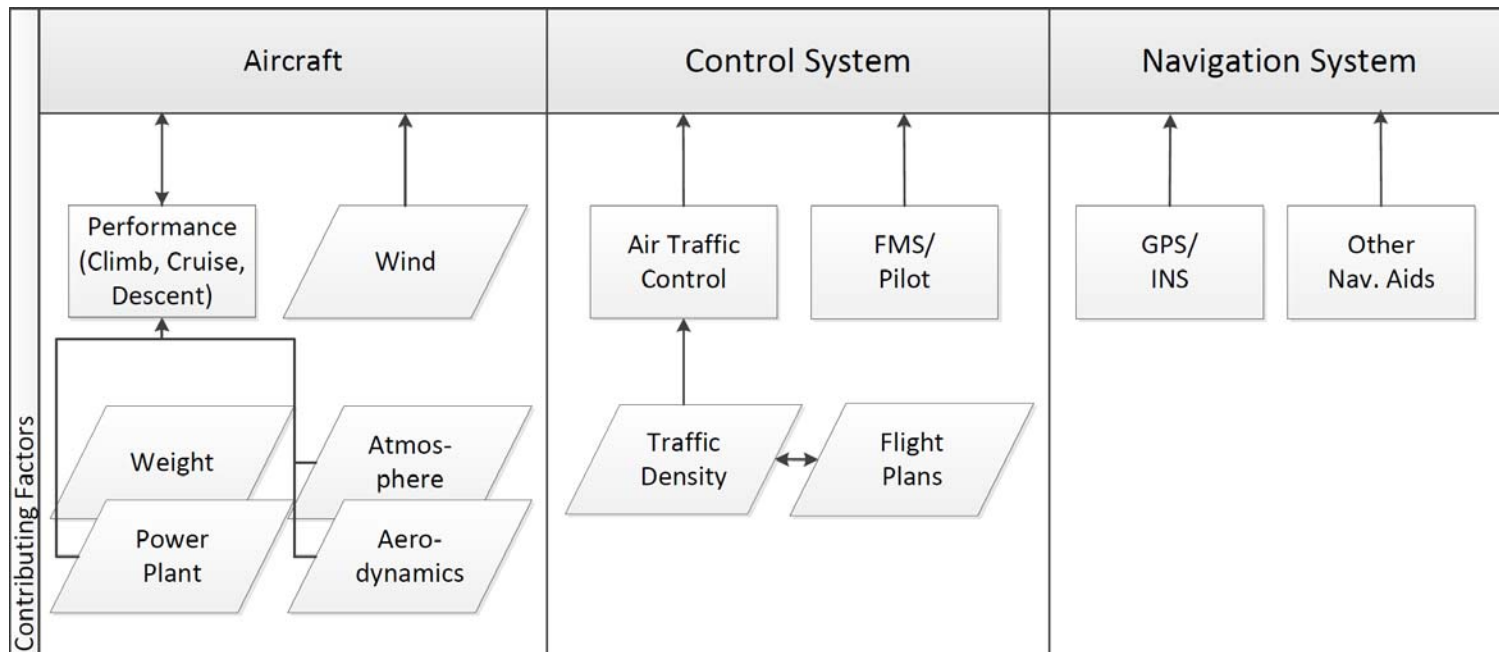


Uncertainties in Trajectory Prediction

Definition:

- Uncertainty describes the possible deviation of the actual from the predicted flight path

Factors contributing to trajectory uncertainties:

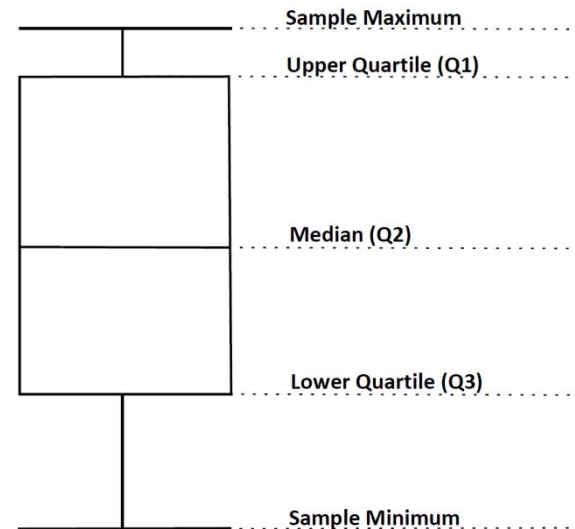
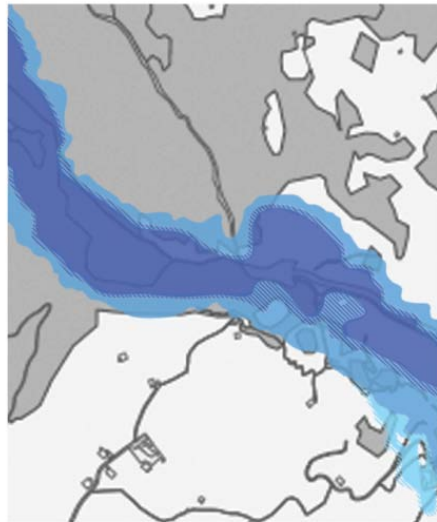


[based on Jinwhan Kim et. Al: Trajectory Uncertainty Modeling for Queuing Analysis of the National Airspace System. NASA]



Visualization of Uncertainties

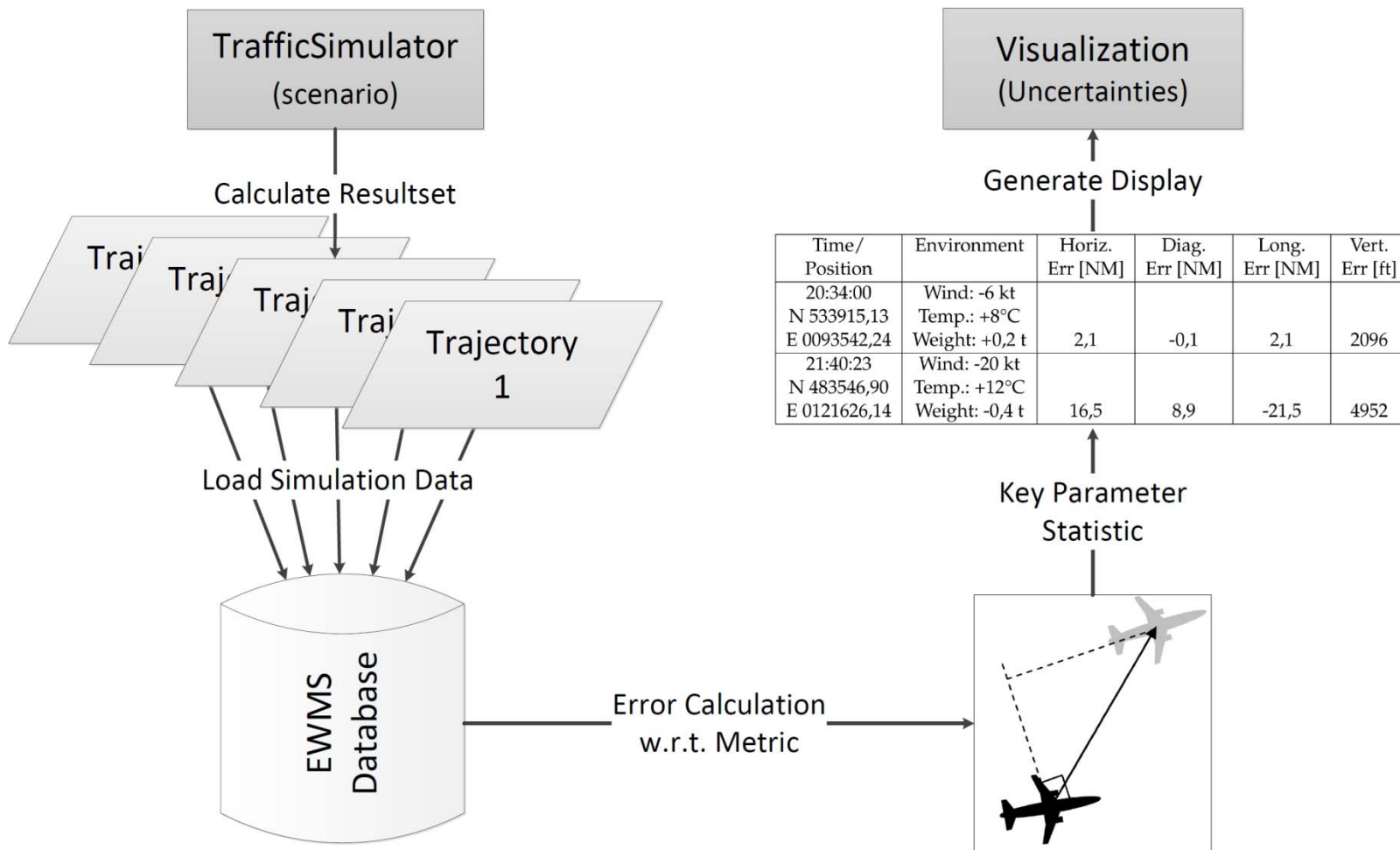
- Issue:
 - Combination of certain and uncertain data
 - Complexity of data structure
- Classification of data and separate evaluation
- Different surface structure, color and shade
- Types of visualization



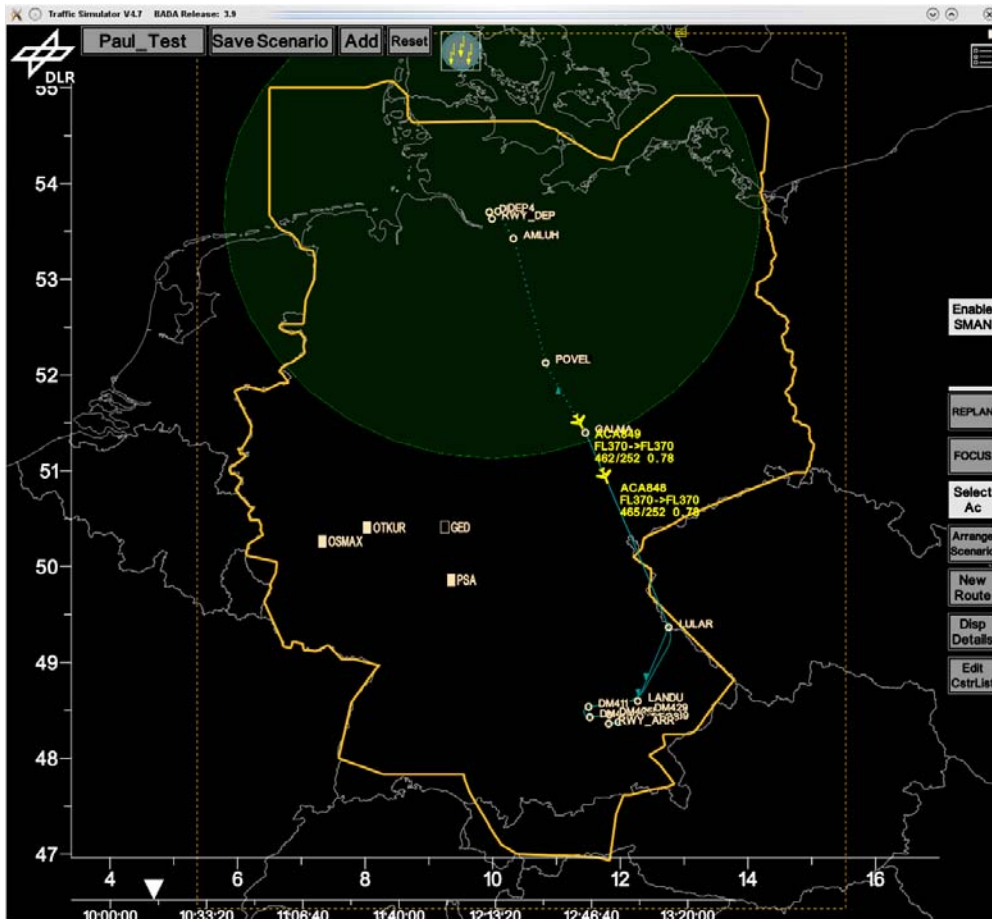
[according to Melanie Kunz et. al: Uncertainty Visualization in Hazard Maps for Consistent Decision Making]



Concept - Workflow



Concept: Simulation [*TrafficSim*]



Required Information:

- Flight Plan
- Way Points
 - *Constraints*
- Aircraft Performance Data
 - *BADA, Perf_Parms*
- Meteorological Conditions

Simulation:

- Variation of parameter makes in sum 2,028 different trajectories for the same route
- Distance: ~ 450 NM
- Fuel Flow: ~ 3,200 kg



Simulation II

Wind Direction in Degree [°]							
0	+ 45	+ 90	+ 135	+ 180	+ 225	+ 270	+ 315

Wind Speed at Ground [kn]				
0	+ 10	+ 20	+ 30	+ 50

Temperature at Ground				
- 5°C (23°F)	+ 5°C (41°F)	+ 15°C (59°F)	+ 25°C (77°F)	+ 35°C (95°F)

Cruise Speed [Ma]		
0.72	0.78	0.82

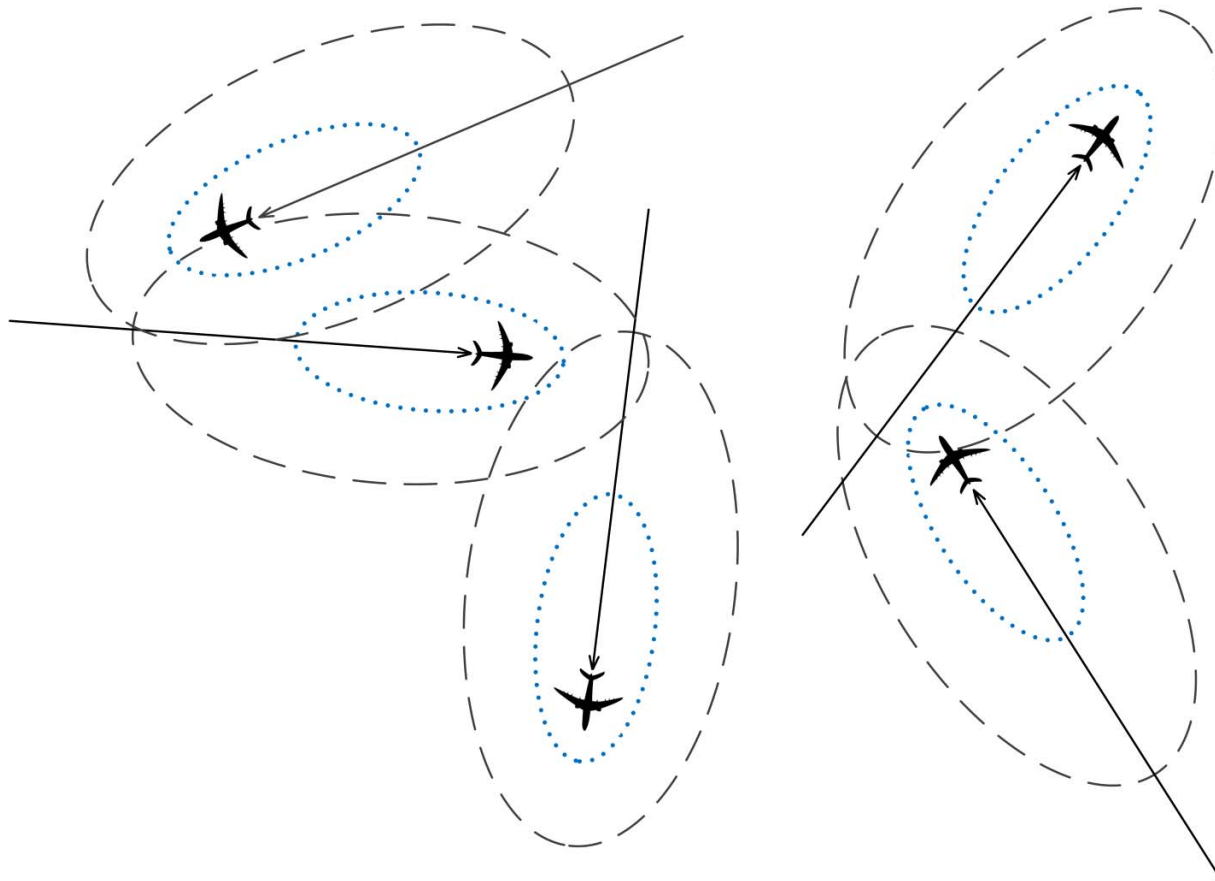
Weight of Aircraft [kg]					
97%	90%	80%	70%	60%	50%
65 857	61 312	54 500	47 687	40 875	34 062



Metrics

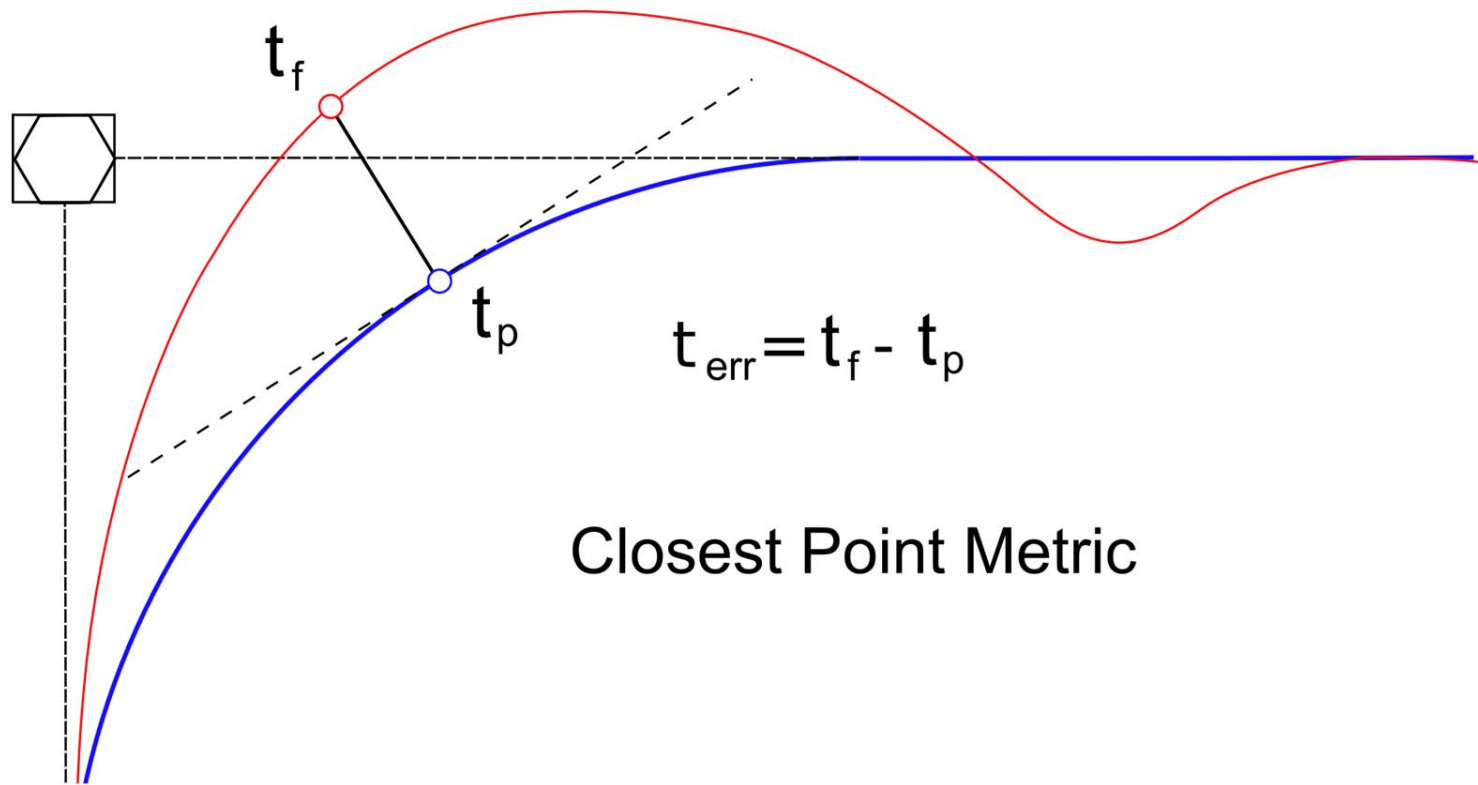
How to describe Uncertainties?

- At any time of flight an ellipsoid defines possible location



Closest Point Metric for Temporal Deviation

- Determination of the closest positions (predicted and actual trajectory)
- Difference between times $\hat{=}$ temporal error

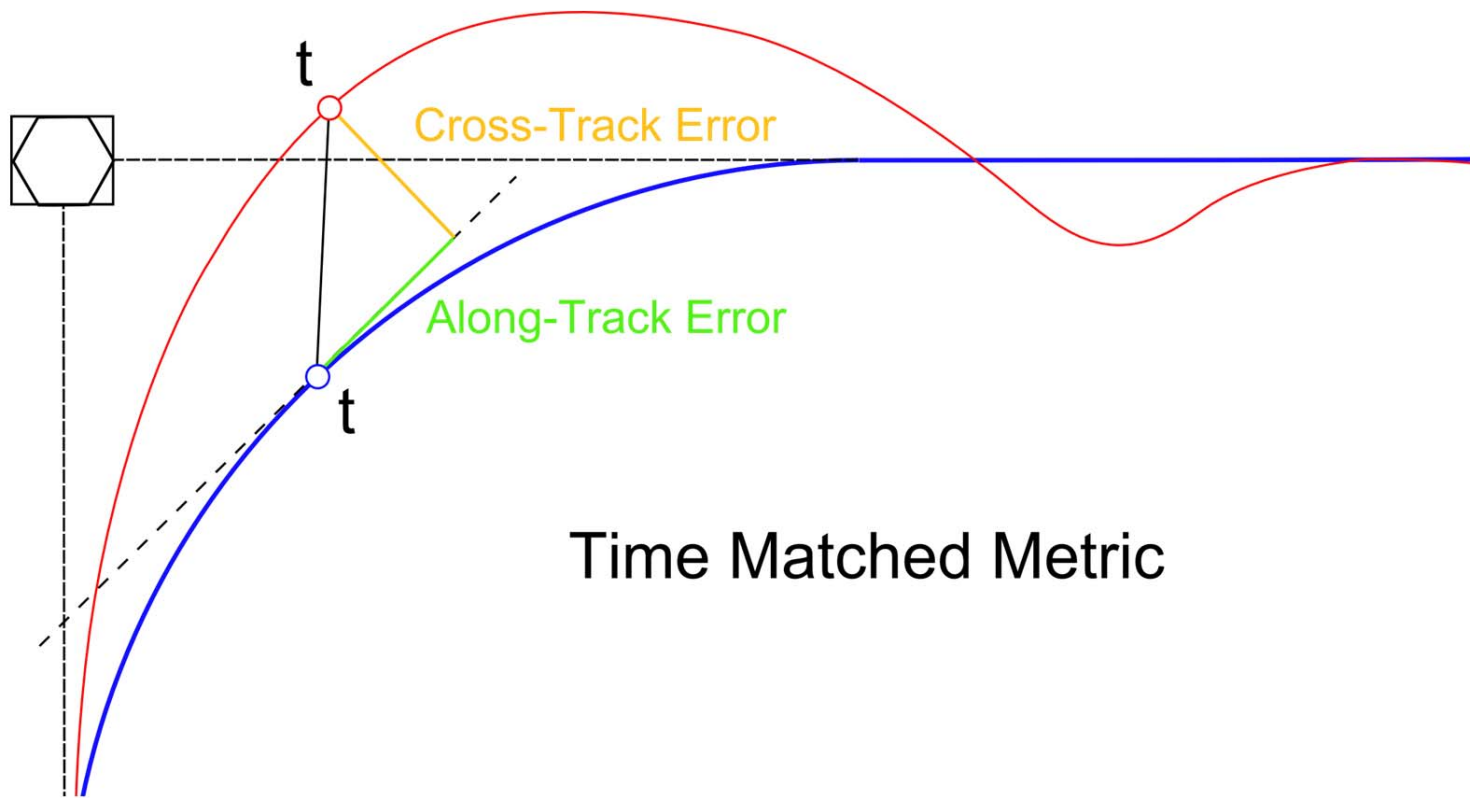


[based on ERASMUS – Air Trajectory Prediction]



Time Matched Metric for Spatial Deviation

- Determination of the positions at the same point in time
- Distinguish different dimensions and bearing



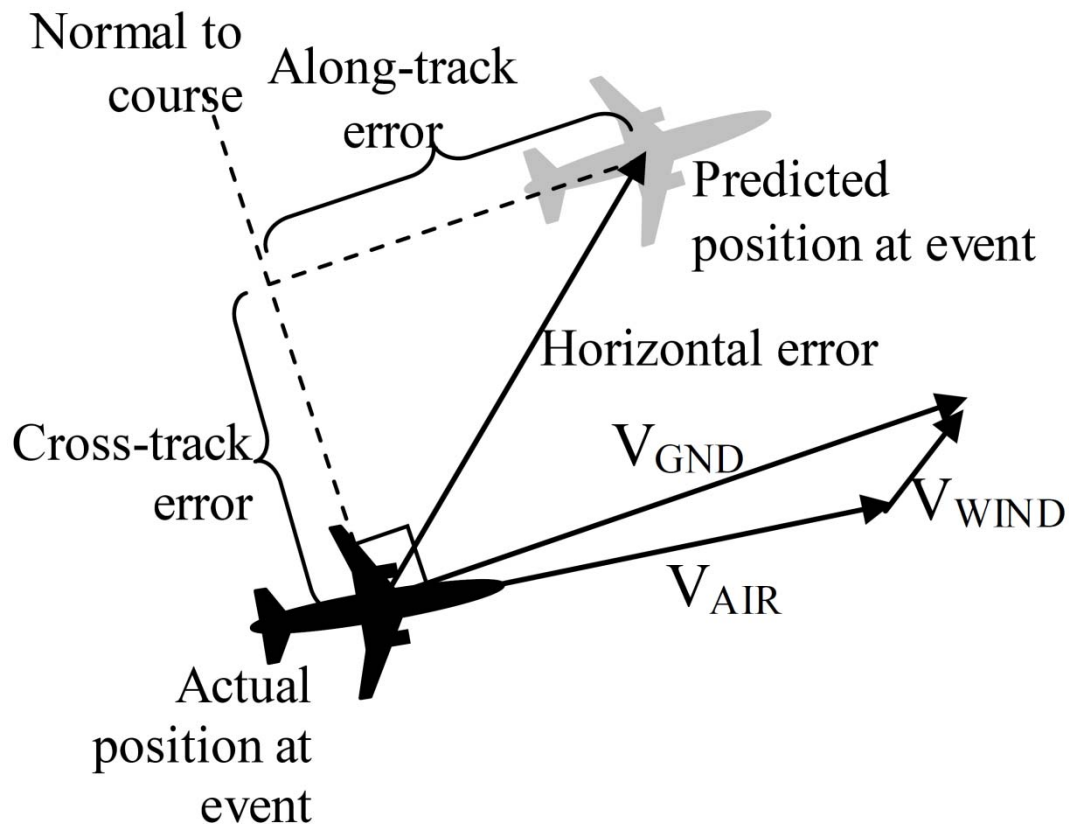
Time Matched Metric

[based on ERASMUS – Air Trajectory Prediction]



Spatial Deviation

Horizontal Error



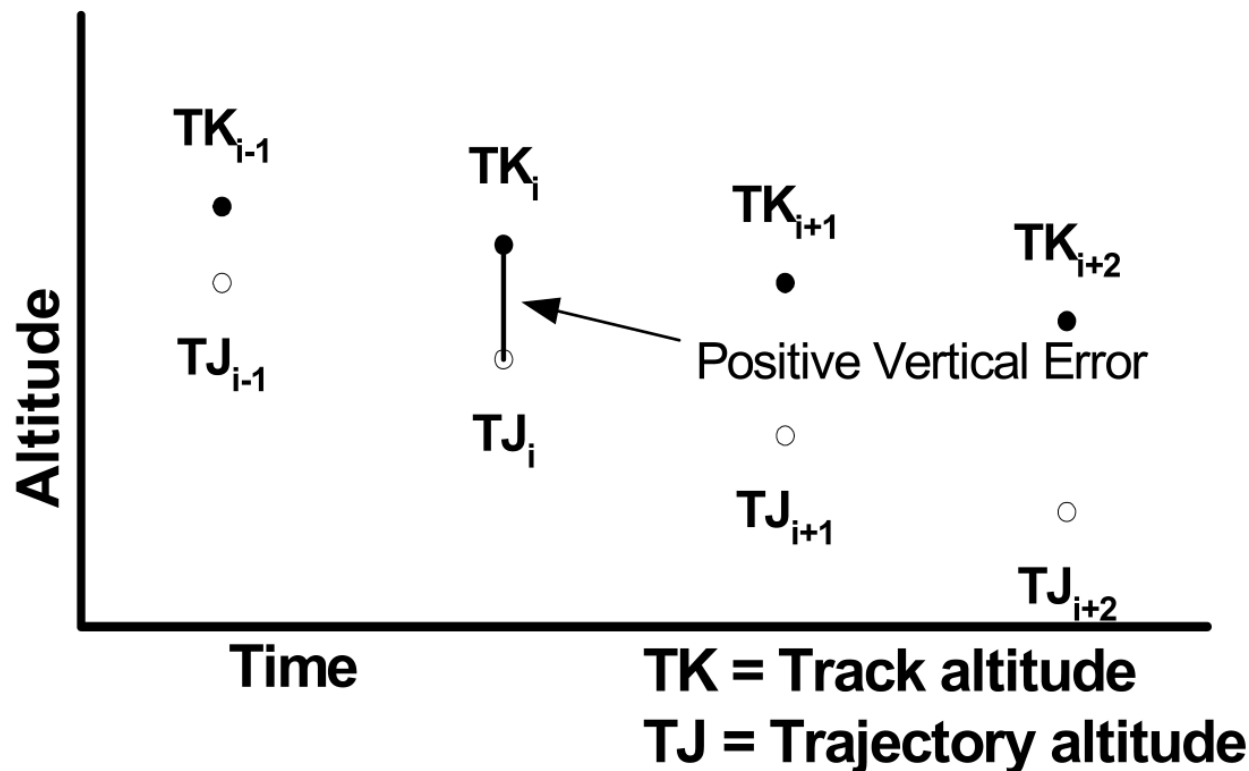
[nach Stephane Mondoloni et.al: Assessing trajectory prediction performance - metrics definition]



Spatial Deviation

Vertical Error

- *Vertical Error = actual altitude – predicted altitude*



[based on Mike Paglione et. al: Implementation and Metrics for a Trajectory Prediction Validation Methodology]



Implementation

Integration of the Concept in *EWMS*

Concept of “Extensible Workflow Management for Simulations” (*EWMS*):

- Common software suite for reporting
- Data processing is independent from the simulator type
- Streamline and simplify simulation data management

- Reporting-Tool to evaluate air traffic simulations extensively, fast and standardized



Implementation - JFreeChart

- Java library to generate diagrams
- Supports functions for export image files, tool tips, zooming
- Cluster results in dependent and independent variables

Independent Variables		Dependent Variables		
Callsign	Time	Position [lat,lon,alt]	Minimal Error [NM]	Maximal Error [NM]
LH1423	11:08:59	48.3668269 N 11.8954822 E 1190.34 ft	- 1.5 NM	0.3 NM
LH1423	11:09:18	48.3652935 N 11.8779739 E 961.85 ft	- 1.2 NM	0.2 NM



Implementation – NASA World Wind

- Three dimensional images in a geo spatial reference system
- Competitive product to Google Earth with focus on scientific investigations
- Maximal resolution is 15 m
- Plot 3D-shapes
 - Cylinders
 - Paths
 - Ellipsoids
- Functions for coordinate transformation
- Add shapes to an layer-model



[<http://www.worldwind.arc.nasa.gov>]

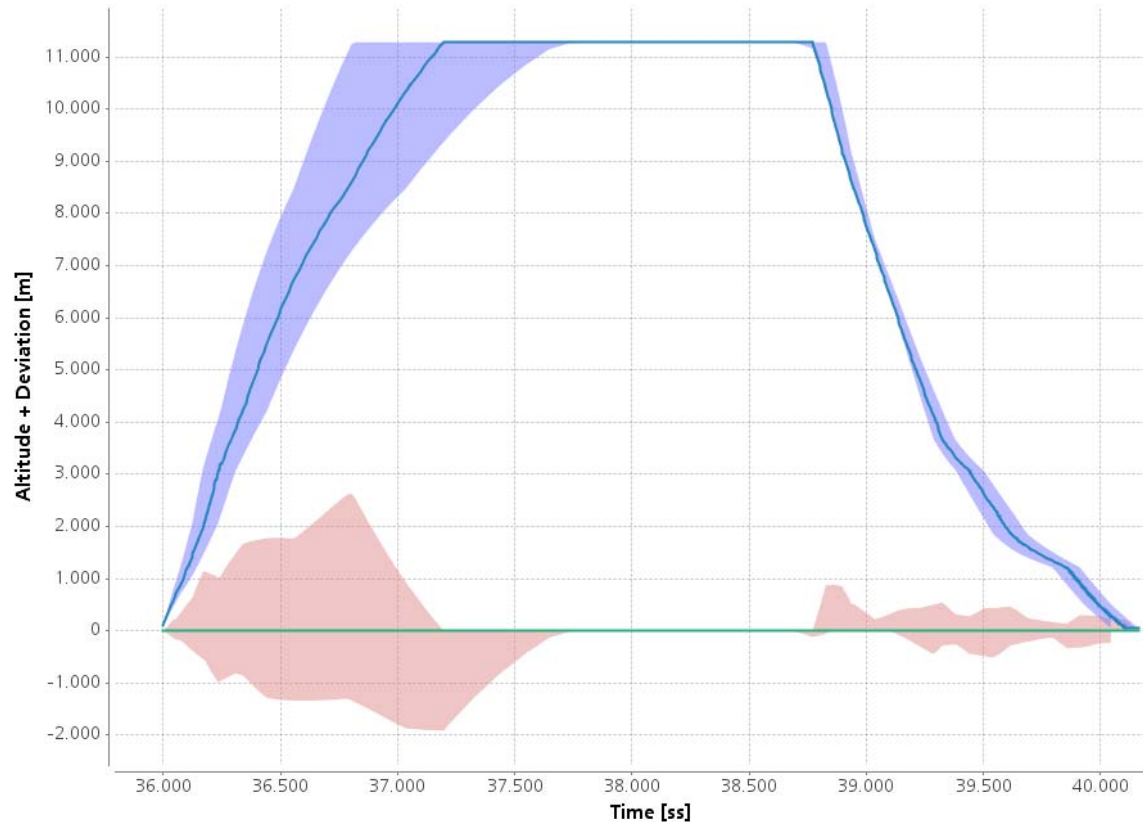


Results

Uncertainty caused by deviation of weight

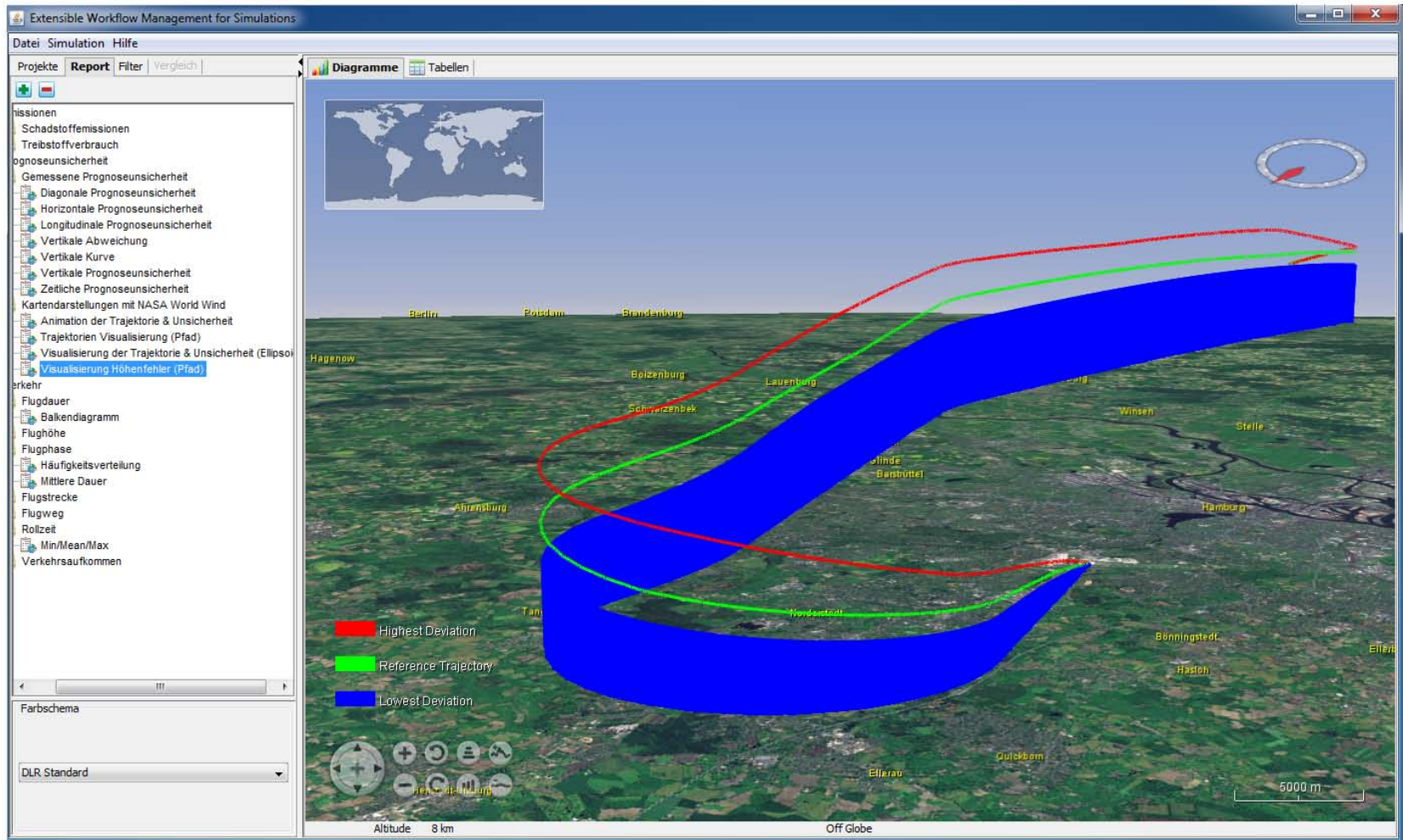
- Reference Flight with 75% of MTOW
- Deviation of 20% in weight
- Other parameters remaining constant and no regulation

Vertical Uncertainty (Curve & Deviation) (GAL5001)



Results

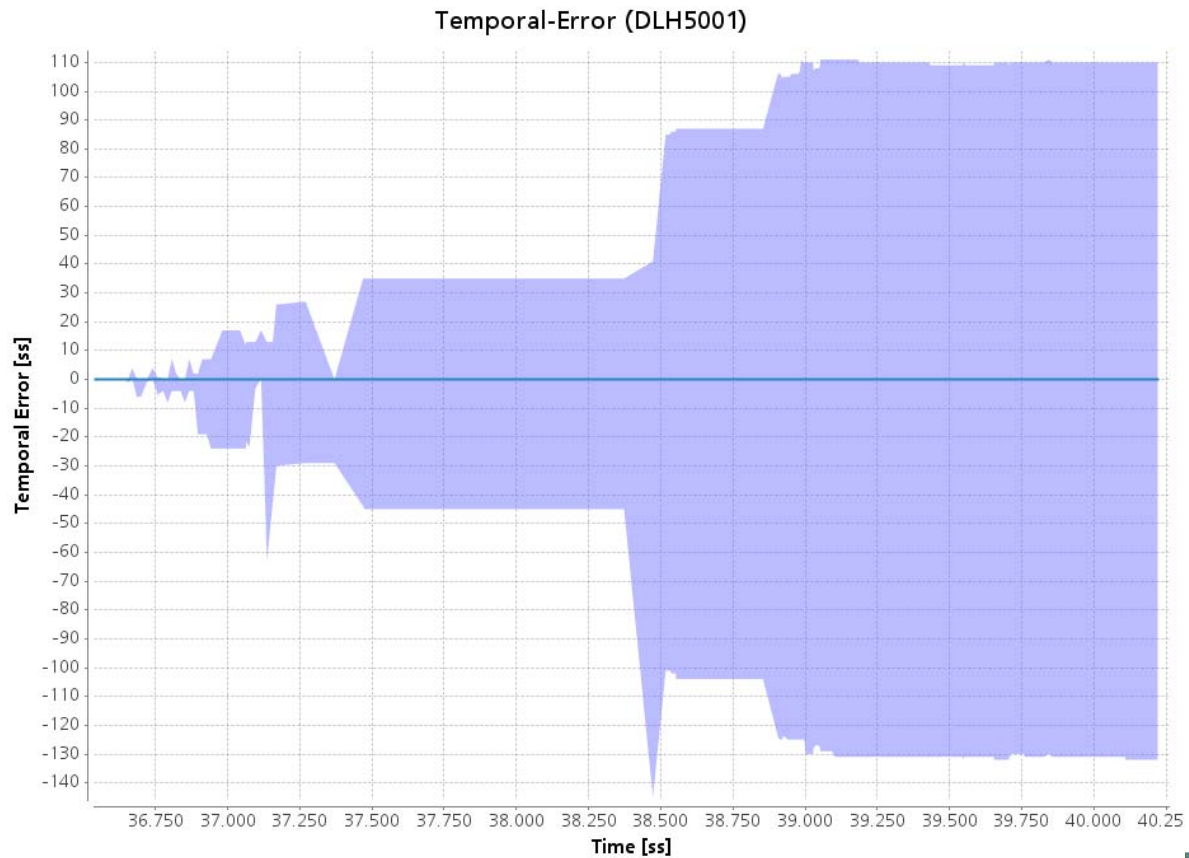
Uncertainty caused by deviation of weight



Results

Uncertainty caused by deviation of speed

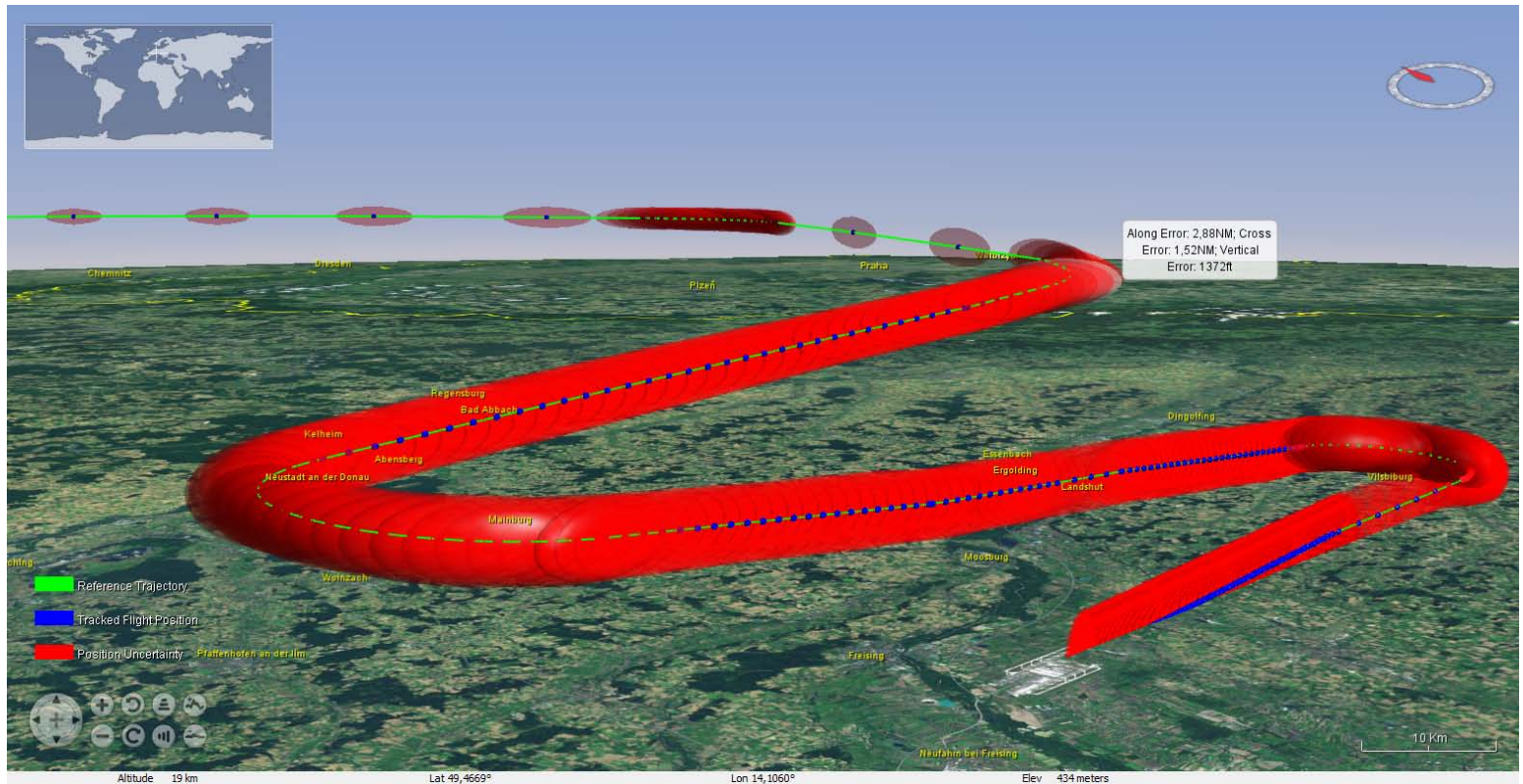
- Reference Flight with $Ma_{ref} = 0.78$ in cruise
- Deviation of $Ma_{dev} = Ma_{ref} \cdot 0.02$
- Other parameters remaining constant and no regulation



Results

Uncertainty caused by deviation of wind

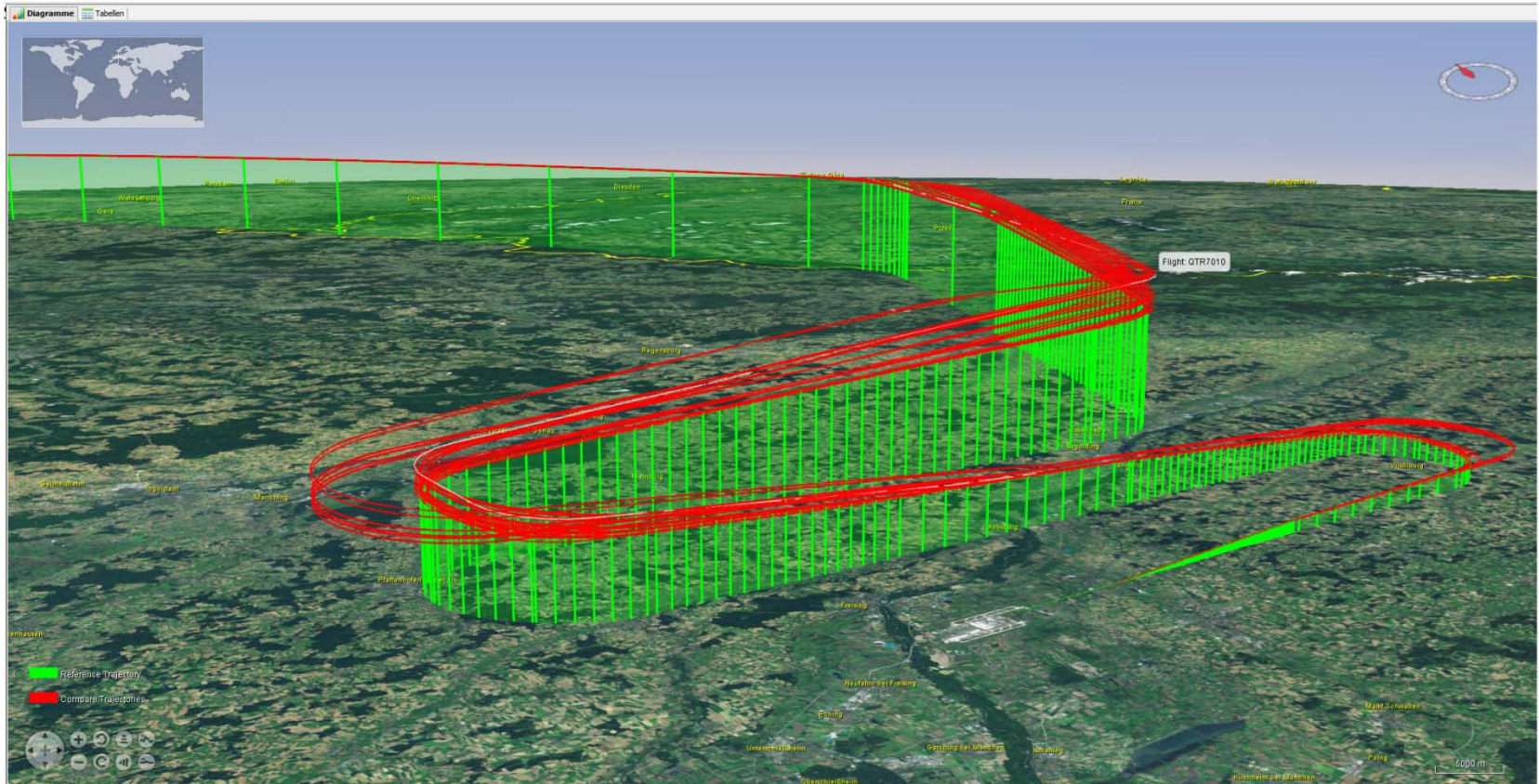
- Reference Flight with wind direction 90
- Deviation of wind speed by 10 kt
- Other parameters remaining constant and no regulation



Results

Simulated Navigation Error

- Different turn radius through RNP deviation



Summary

- Load *TrafficSim*-Data to Database
- Calculating Uncertainties based on a set of trajectories
- *JFreeChart*-Diagrams:
 - horizontal, along-track and cross-track error
 - vertical error
 - temporal error
- 3D-NASA World Wind Visualization:
 - Path of trajectories
 - Vertical uncertainty
 - Uncertainty described by ellipsoids
 - animation



Conclusion

- System to determine and analyze uncertainties in 4D-Trajectory prediction
- Predicted trajectory is visualized with expected deviations
- Report works with *TrafficSim* and further simulation systems

Future Research

- More tests by implementing simulation scenarios with higher traffic density
- Calculate conflict probability by using volume of intersecting ellipsoids
- The better the parameter forecast, the smaller the uncertainties



Determination and Visualization of Uncertainties in 4D-Trajectory Prediction

Paul Weitz, German Aerospace Center (DLR)

Institute of Flight Guidance



Internet

www.DLR.de

E-mail

paul.weitz@dlr.de

