

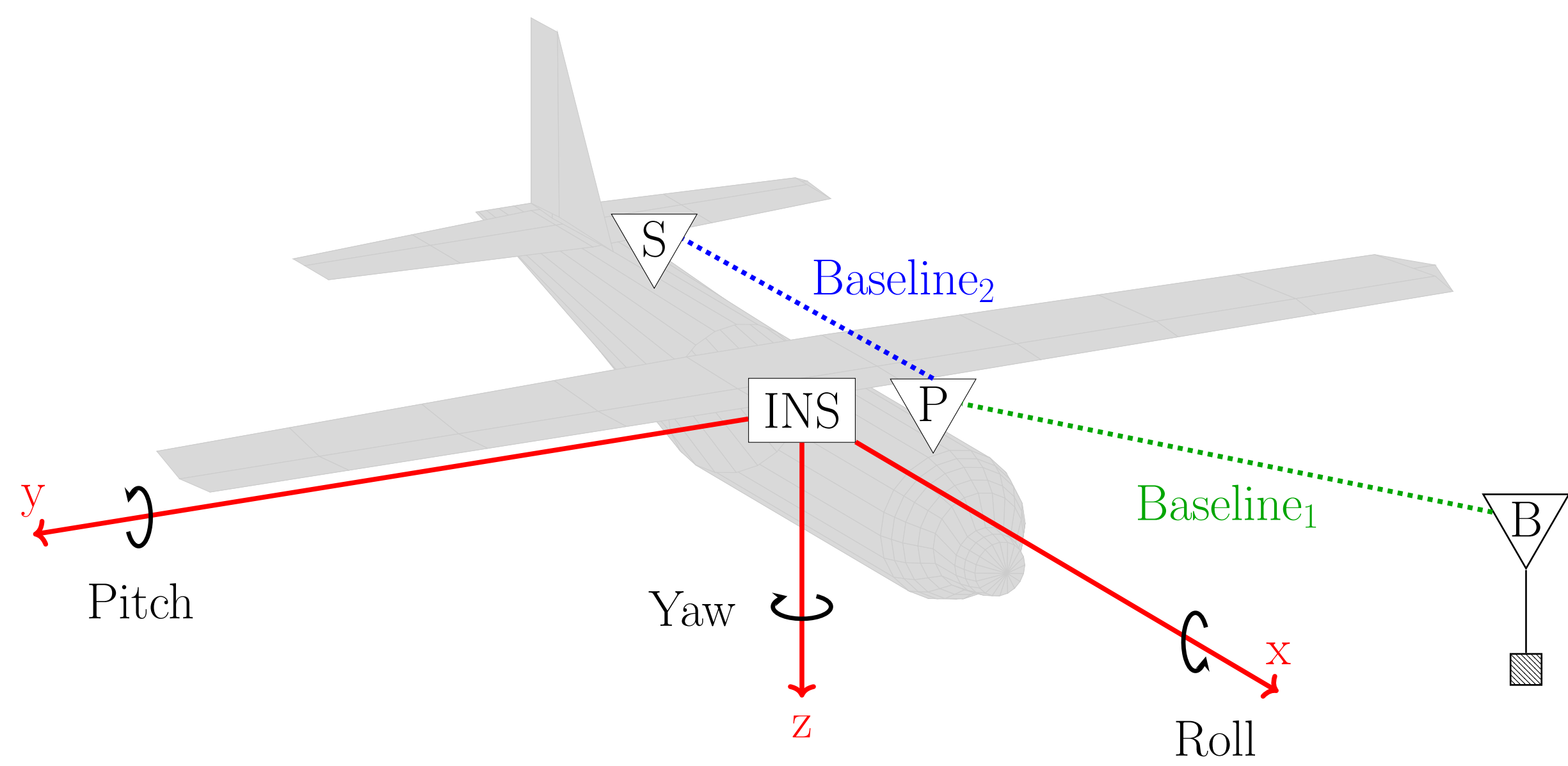
# Position and attitude estimation using tightly coupled multi baseline multi constellation GNSS and inertial sensor fusion

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## Abstract

- Position and attitude determination algorithm
- Tightly coupled sensor fusion for using low-cost multi antenna, multi GNSS and inertial sensor observations
- Post-processed kinematic positioning (PPK) solution with Extended Kalman Filter (EKF) realization
- Real case study with a UAV platform
  - Two low-cost u-blox NEO-M8T GNSS receivers, primary (P), secondary (S)
  - PIXHAWK flight controller computer with INS sensors
  - Sony ILCE-6000 camera for photogrammetric data collection
  - A low-cost u-blox NEO-M8T ground based GNSS base station (B)
- Fusing accelerometer and gyroscope observations with GNSS code, carrier-phase and Doppler observations

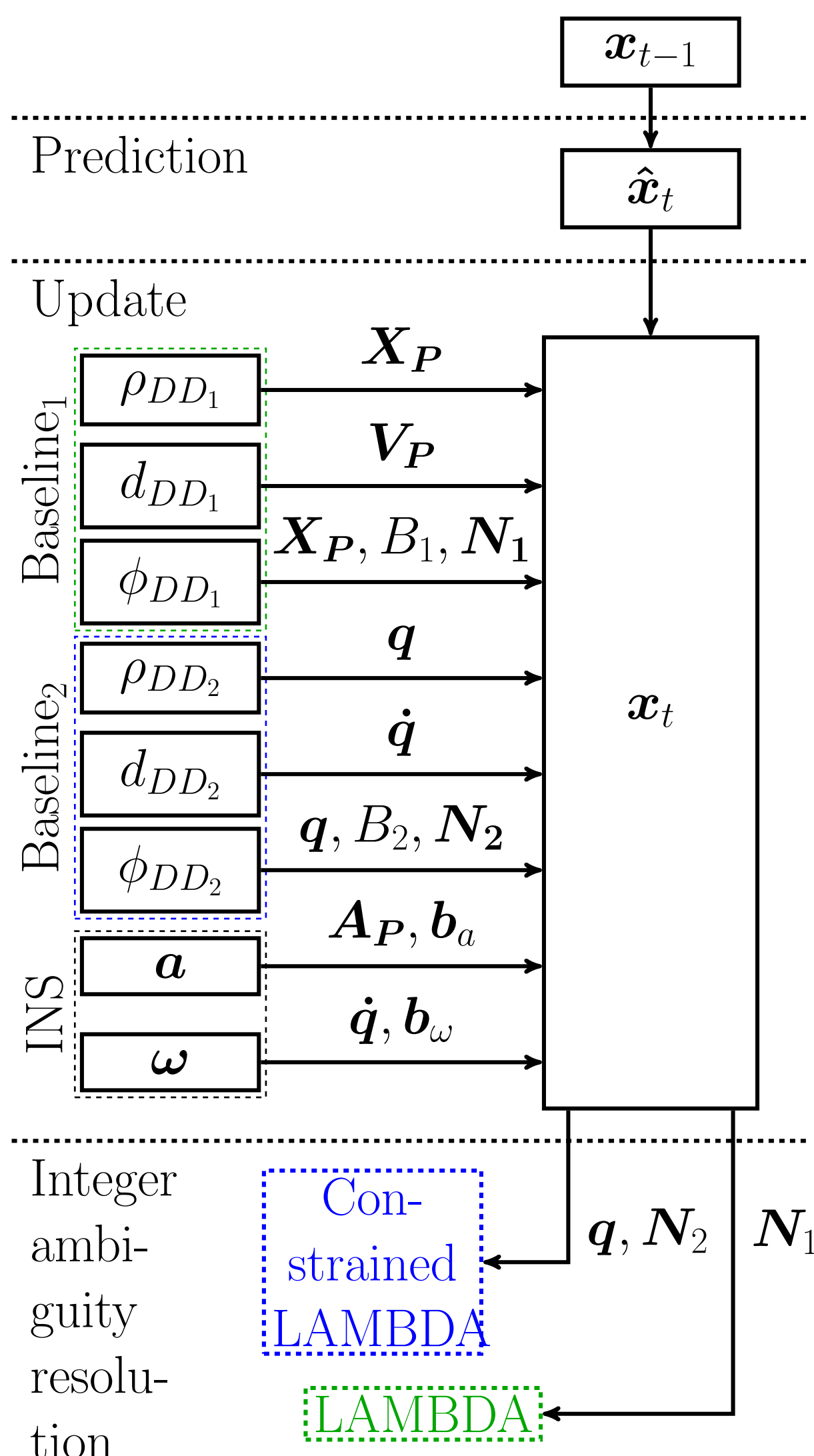


- Positioning of the platform
  - GNSS observations of the first baseline between the base station and the primary receiver
  - Acceleration data
- Quaternion based attitude estimation
  - GNSS observations taken in the second, moving baseline
  - Gyroscope data
- The integer ambiguities are resolved by the LAMBDA method for the position and a quaternion constrained modified LAMBDA method for the UAVs moving baseline
- The position estimations are compared with the post-processed solution of RTKLIB software
- The attitude estimations are compared with the estimations of the onboard flight controller system and both of them are validated using post-processed attitude information obtained from photogrammetric data processing (PGP) with PIX4D software

## Estimation algorithm

The estimation is based on an Extended Kalman Filter algorithm. The estimated states, which are linked to the navigation data and the different sensor errors are

- Position ( $\mathbf{X}_P$ ), velocity ( $\mathbf{V}_P$ ) and acceleration ( $\mathbf{A}_P$ ) of the Primary GNSS antenna in ECEF Coordinate system
- Orientation quaternions ( $\mathbf{q}$ ), quaternion derivatives ( $\dot{\mathbf{q}}$ )
- Accelerometer bias error ( $\mathbf{b}_a$ ), gyroscope bias error ( $\mathbf{b}_\omega$ )
- GNSS receiver clock biases for every receiver ( $\delta_i^{GPS}, \delta_i^{GAL}, \delta_i^{GLO}$ )
- GNSS receiver clock drifts for every receiver ( $\dot{\delta}_i^{GPS}, \dot{\delta}_i^{GAL}, \dot{\delta}_i^{GLO}$ )
- Single differenced inter-channel biases for every baseline ( $\mathbf{B}$ )
- Single differenced integer ambiguities for every baseline and every satellite ( $\mathbf{N}$ )



## Integer ambiguity resolution

The original LAMBDA minimization problem is used for the first baseline

- The float integer ambiguities in double differenced form ( $\hat{\mathbf{x}}_N$ )
- The covariance matrix of the double differenced float integer ambiguities ( $\hat{\mathbf{x}}_N$ )
- The optimal integer valued vector of the ambiguities ( $\check{\mathbf{x}}_N$ )

$$\check{\mathbf{x}}_N = \arg \min_{\mathbf{x}_N \in \mathbb{Z}^m} \|\mathbf{x}_N - \hat{\mathbf{x}}_N\|_{\hat{\mathbf{P}}_{NN}}^2$$

The quaternion constrained LAMBDA method for the second, moving baseline

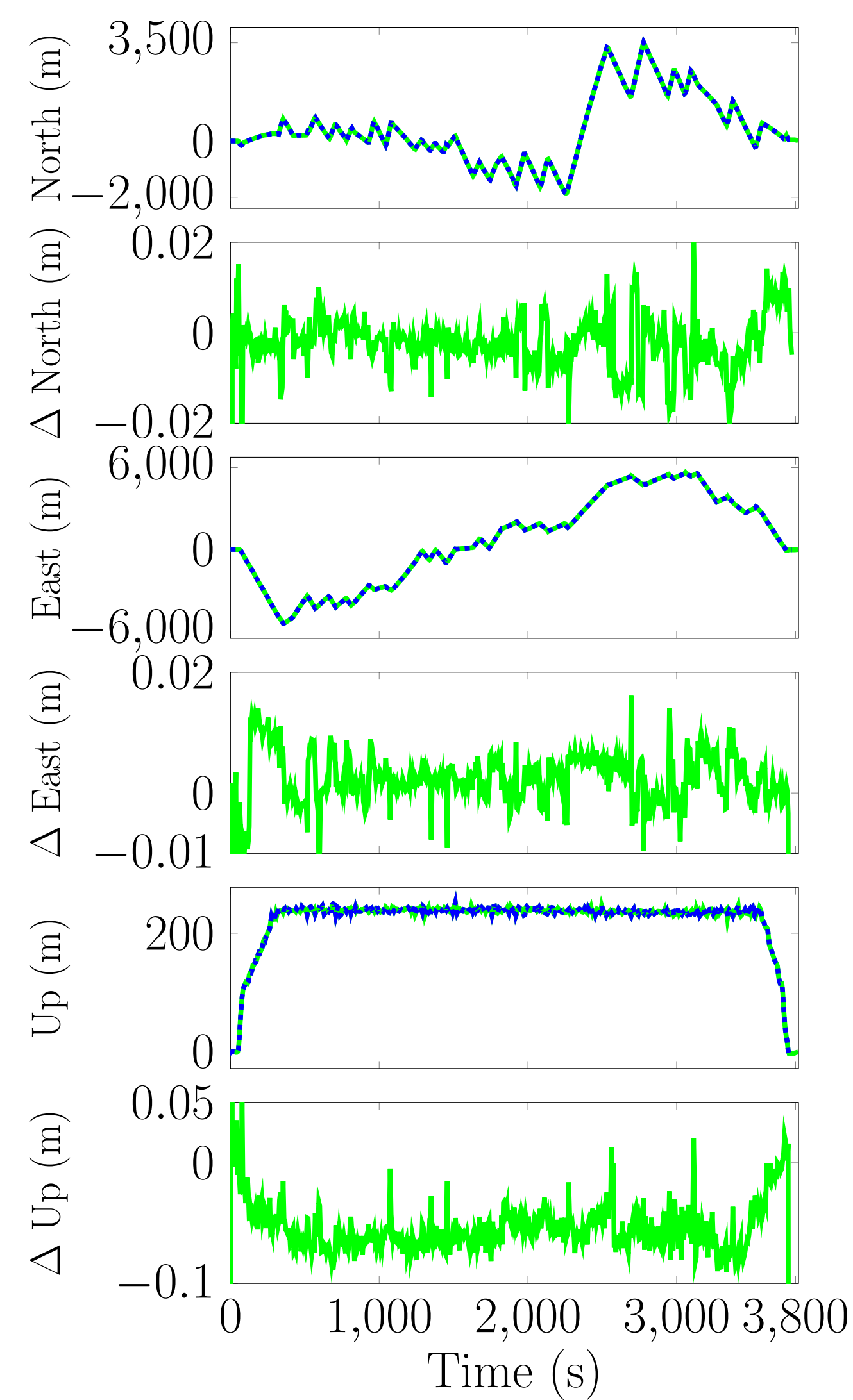
- The first part of the equation is the original cost function part
- The second part represents the quaternion constraint with the conditional quaternion vector ( $\hat{\mathbf{x}}_q(\mathbf{x}_N)$ ), its covariance matrix ( $\hat{\mathbf{P}}_{q(N)q(N)}$ ) and  $\check{\mathbf{x}}_q(\mathbf{x}_N)$  in the second part of  $C(\mathbf{x}_N)$  equation is the second optimization

$$\check{\mathbf{x}}_N = \arg \min_{\mathbf{x}_N \in \mathbb{Z}^m} (C(\mathbf{x}_N))$$

$$C(\mathbf{x}_N) = \|\mathbf{x}_N - \hat{\mathbf{x}}_N\|_{\hat{\mathbf{P}}_{NN}}^2 + \|\hat{\mathbf{x}}_q(\mathbf{x}_N) - \check{\mathbf{x}}_q(\mathbf{x}_N)\|_{\hat{\mathbf{P}}_{q(N)q(N)}}^2$$

$$\check{\mathbf{x}}_q(\mathbf{x}_N) = \arg \min_{\|\mathbf{x}_q\|^2=1} \|\hat{\mathbf{x}}_q(\mathbf{x}_N) - \mathbf{x}_q\|_{\hat{\mathbf{P}}_{q(N)q(N)}}^2$$

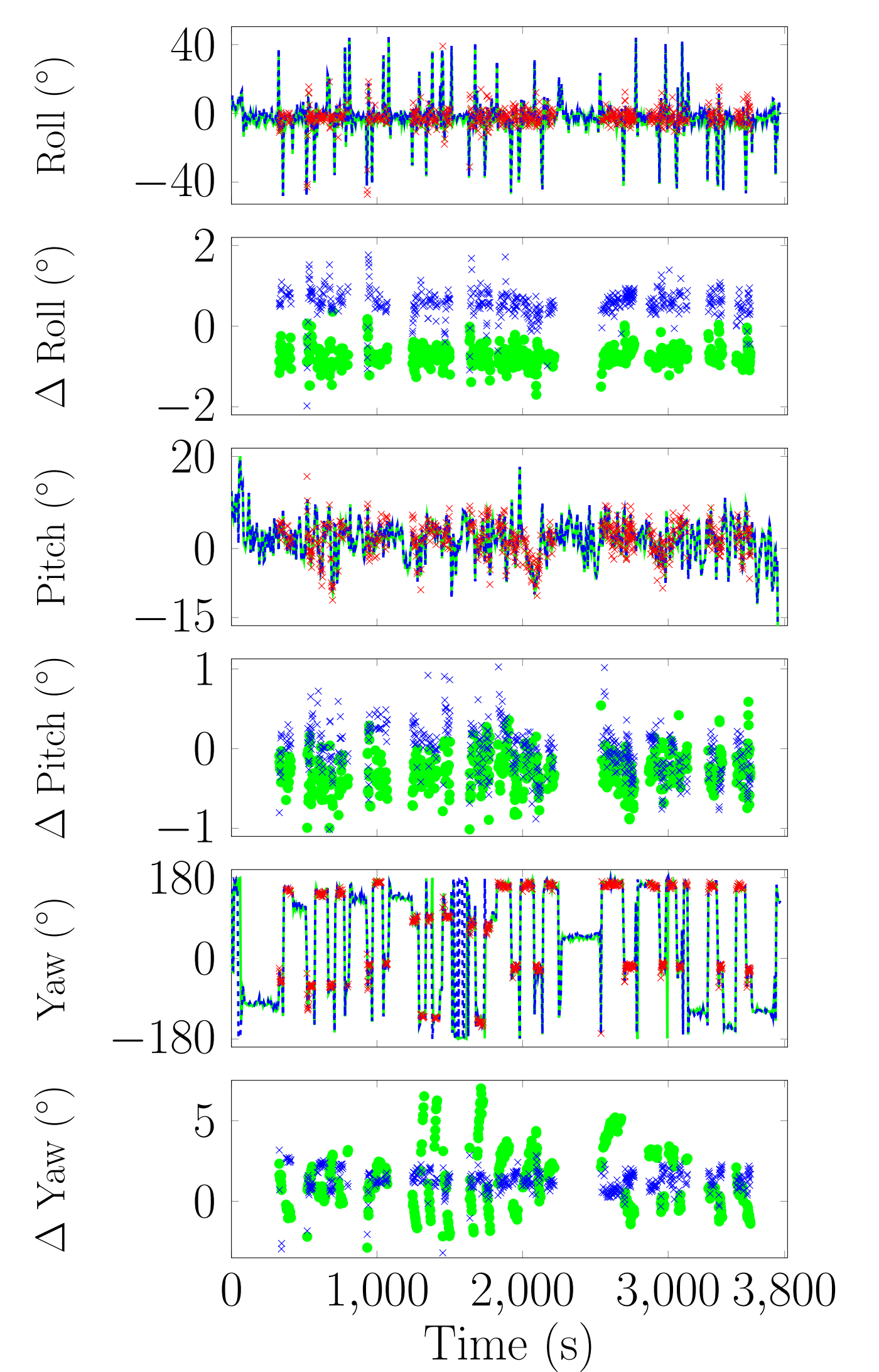
## UAV flight test results



Comparison of the PPK (—) and the EKF (---) coordinate solutions and their differences ( $\Delta$ )

		North	East	Up
EKF <sub>AR</sub> - PPK coordinates [m]	mean	-0.003	0.002	-0.055
	rms	0.008	0.004	0.059
AR success rate		92.91%		
PIXHAWK - PIX4D Euler angles [°]	mean	-0.72	-0.30	1.27
	rms	0.77	0.42	2.47
EKF - PIX4D Euler angles [°]	mean	0.57	-0.04	1.15
	rms	0.68	0.37	1.71
AR success rate		88.18%		

- The duration of the flight was 3800 seconds
- 7 GPS, 4 Galileo and 7 Glonass satellites were received



Comparison of the PGP (—), PIXHAWK (---) and the EKF (---) solution's Roll, Pitch and Yaw angles and the differences from the PGP solution PIXHAWK (•), EKF (•)

- The duration of the flight was 3800 seconds
- 7 GPS, 4 Galileo and 7 Glonass satellites were received
- Integer ambiguities were resolved for GPS and Galileo satellites
- Maximal length of the first baseline was 6 kilometres
- The second baseline was 0.29 meters long
- Sony ILCE-6000 camera took 540 pictures during the flight at several mapping areas for the photogrammetric data acquisition

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