

Combined data assimilation of airborne and ground-based GNSS ZTDs



Introduction

In this study, we aim to improve the numerical weather models (NWMs) by assimilating both airborne and ground-based GNSS ZTDs using WRF model. We obtained airborne GNSS zenith total delays (ZTDs) from an unmanned aerial vehicle (UAV) and ground-based GNSS ZTDs from static stations. We then designed various cases, including no GNSS ZTDs assimilation, only airborne GNSS ZTDs assimilated, only ground-based GNSS ZTDs assimilated and combined data assimilation of airborne and ground-based GNSS ZTDs. Finally, cases were compared among each other as well as to external data sets including ERA5 reanalysis and radiosonde.

GNSS ZTDs

- ✓ Ground-based ZTDs were obtained from static stations in postprocessing mode while airborne ZTDs were obtained from highlykinetic UAV in simulated real-time mode.
- ✓ Both processed in Precise Point Positioning (PPP) mode.



Fig.1 UAV trajectory

Tab. 1 GNSS ZTDs processing configurations

Scheme platform Observations Spatial coverage Temporal	GNSS data processing		
	Ground-based	Airborne	
platform	Crustal Movement Observation Network of China	Highly-kinetic UAV	
Observations	GPS dual frequency ion-free	BDS dual frequency ion-free	
Spatial coverage	Single point	80 km in horizontal and 3 km in vertical (Fig.1)	
Temporal resolution	300 s	0.1 s (10 Hz)	
Estimator	Least squares method (LSQ)	Square root information filter (SRIF)	
Precise Products	IGS SP3 orbits and satellite clocks	Archive IGS real-time products	
Processing mode	PPP	PPP	
Coordinates	Constant parameter	Kinetic parameter	
Software	PANDA (Shi et al. 2008)	In-house GMET	
ZTD model	Fixed stochastic model	Dynamic stochastic model (Zhang et al. 2022)	
ZTD accuracy	Around 8 mm	Around 16 mm	

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WRF data assimilation (WRFDA) experiment WRF settings

- ✓ NCEP GFS products, $0.25^{\circ} \times 0.25^{\circ}$, 3 hour forecast.
- \checkmark Three domains, with spatial resolution of 9 km, 3 km, and 1 km (Fig. 2a).



Fig.2 WRF experiment settings

WRFDA settings

- ✓ Ground-based GNSS ZTDs: six stations at 01:00 UTC (**Fig. 2b**).
- ✓ Airborne GNSS ZTDs: thinned to Green 10 min, blue 5 min, and yellow 1 min (Fig. 2c) and were compensated with the ZTD temporal change based on ERA5.
- \checkmark 3D-Var method. ZTDs in 30 min before and after DA time were assimilated (Fig. 3).
- \checkmark A total of 7 cases are designed as shown in Tab. 2.



Fig.3 WRFDA procedure

Humidity gain after DA

• The specific humidity profile of the GFS-driven background and the gain for each case above all the GNSS stations are plotted in Fig. 4.

• Sub results

- a) Humidity decreased if only groundbased GNSS ZTDs were assimilated.
- b) Humidity increased if only airborne GNSS ZTDs were assimilated.
- c) Humidity increased in the low pressure layers while decreased in the upper pressure layers if both ground-based and airborne GNSS ZTDs were assimilated.



(c) Airborne GNSS ZTDs distribution

Tab. 2 WRFDA experiment design

Casa	Assimilated	GNSS ZTDs Airborne × 1 min 5 min 10 min 1 min
Case $\frac{Assimilated GN}{Ground-based}$ CTRL × G V A01 × A05 ×	Airborne	
CTRL	×	×
G	\checkmark	×
A01	×	1 min
A05	×	5 min
A10	×	10 min
GA01	\checkmark	1 min
GA05	\checkmark	5 min
GA10	\checkmark	10 min

Evaluation based on ERA5

- Bias and RMS of the ZTD error for each case are presented in Tab. 3

• Sub results

- GNSS ZTDs were assimilated.
- GNSS ZTDs were assimilated.



Evaluation based on radiosonde

- case are plotted in Fig. 5.
- Bias and RMS of the RH error for each case are presented in **Tab. 4**

• Sub results

- a) GFS-driven background over-estir
- b) RH errors were significantly decre based GNSS ZTDs were assimilated
- c) RH errors were minimum wher based and high resolution airbo were assimilated.

Summary

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Reference:

Zhang, Z., et al. 2022: Dynamic stochastic model for estimating GNSS tropospheric delays from air-borne platforms. GPS Solutions 27(1): 39. Shi, C., et al. 2008: Recent development of PANDA software in GNSS data processing. International Conference on Earth Observation Data Processing and Analysis, SPIE.



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• With ERA5 ZTD as reference, ZTD error of WRF d03 are plotted in Fig. 5.

a) ZTDs were over-estimated for GFS-driven background and further over-estimated if only airborne

b) ZTDs were under-estimated if only ground-based GNSS ZTDs were assimilated. c) The bias and RMS of ZTD error decreased if both ground-based and high resolution airborne

Tab. 3 ZTD error statistics (w.r.t. ERA5)					
Analysis	ZTD error (cm)				
Analysis	Bias	RMS			
CTRL	0.68	1.93			
G	-1.63	2.35			
A01	0.89	2.00			
A05	1.11	2.14			
A10	1.05	2.11			
GA01	-0.34	1.53			
GA05	-0.72	1.70			
GA10	-0.95	1.84			

Fig.5 ZTD error (w.r.t. ERA5)

• With radiosonde as reference, the relative humidity (RH) error profile for each ²⁰⁰

	Tab. 4 RH error statistics			
	Analysis	RH error (%)		- ,
mated DU		Bias	RMS	- :
пацей кп.	CTRL	9.56	17.08	-
eased if ground-	G	4.79	13.35	I
ed.	A01	8.79	16.19	
n both ground	A05	10.10	17.57	
n both ground-	A10	10.05	17.53	
orne GNSS ZTDs	GA01	3.12	11.71	
	GA05	4.12	12.57	
	GA10	4.32	12.75	_



Combined data assimilation of ground-based and airborne GNSS ZTDs can significantly improve the accuracy of numerical weather models in terms of ZTD and humidity.

Combined data assimilation has better performance than merely assimilating ground-based or airborne ZTDs, where airborne ZTDs could help further decrease the humidity bias.

✓ When assimilating airborne ZTDs, a higher spatial-temporal resolution leads to a larger improvement.