



MEMS-based IMU Assisted Real Time Difference Using Raw Measurements from Smartphone

Speaker: Qiang LIU

wuzida@sjtu.edu.cn

Oct 2018





1

Introduction & Motivation

2

RTD+IMU Positioning Algorithm

3

Experiment Architecture

4

Result and Analysis

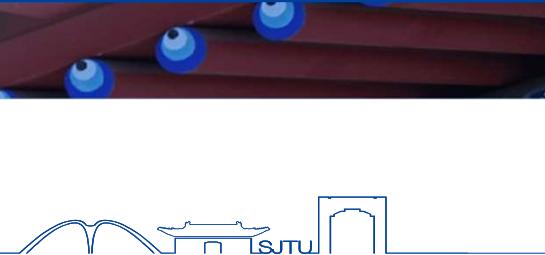
5

Conclusion & Future Works



上海交通大学
SHANGHAI JIAO TONG UNIVERSITY

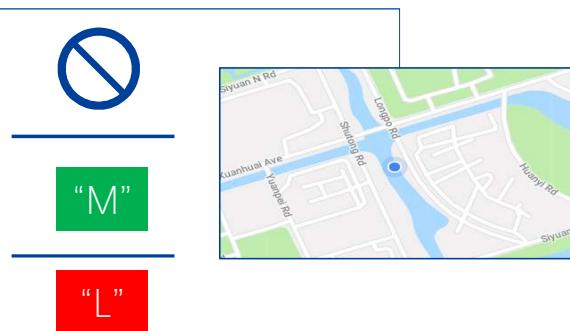
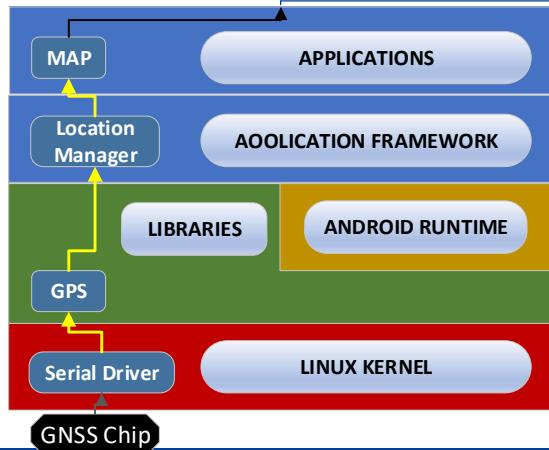
Introduction & Motivation



- Low cost tendency for high precision positioning



- GNSS raw measurement unavailable



ANDROID NOUGAT
GnssMeasurement

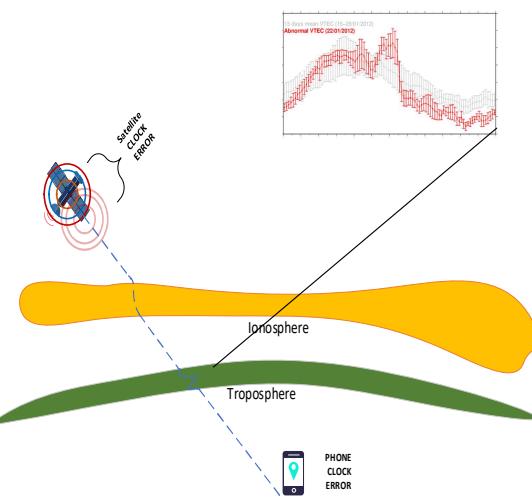
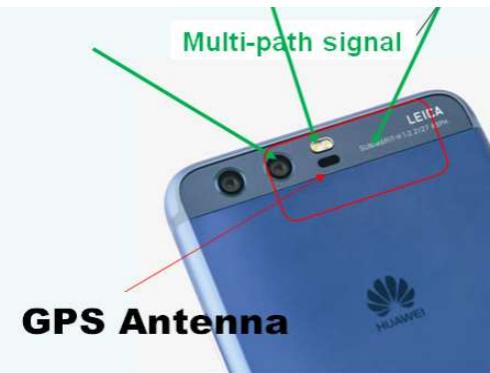
GnssClock





Introduction & Motivation

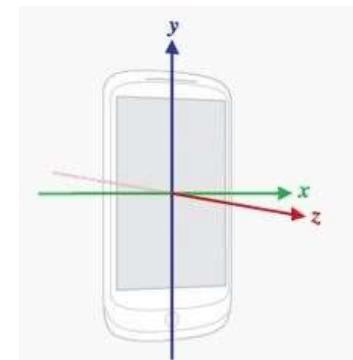
- Complex noise sources



- IMU Auxiliary

Rotation matrix

`getRotationMatrixFromVector`



`TYPE_LINEAR_ACCELERATION`

Acceleration in body-frame

IMU enable to offer high accurate rotate and accelerate information



1

Introduction & Motivation

2

RTD+IMU Positioning Algorithm

3

Experiment Architecture

4

Result and Analysis

5

Conclusion & Future Works



上海交通大学
SHANGHAI JIAO TONG UNIVERSITY



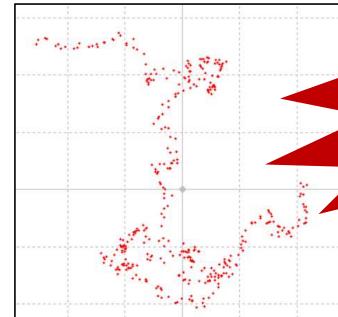
RTD+IMU Positioning Algorithm

- Traditional Pseudorange single point

$$\rho^{(n)} = r^{(n)} + \delta t_u - \delta t^{(n)} + I^{(n)} + T^{(n)} + \zeta_{\rho}^{(n)}$$

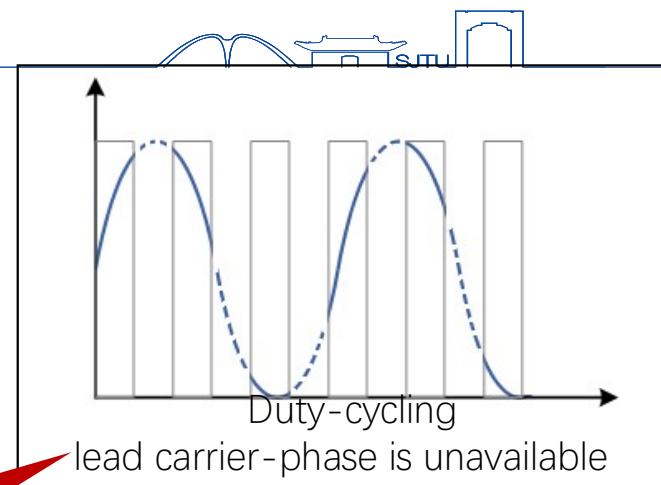
Nonlinear

Least Square



Multiple iterations

Not smooth



RTD+IMU Positioning Algorithm

▪ Kalman Filter

$$\rho_u^{(n)} = r_u^{(n)} + \delta t_u - \delta t^{(n)} + I_u^{(n)} + T_u^{(n)} + \xi_{\rho u}^{(n)}$$

$$\dot{\rho}_u - v^{(n)} \cdot I_u + \delta f^{(n)} - \zeta \rho_u = -v_u \cdot I_u + \delta f_u$$



- Doppler measurement accuracy is **one hundred times** the pseudorange accuracy
- Ionosphere and troposphere errors can result **dozens of meters**, difference or dual frequency correction is common method to eliminate these errors.
- Rover baseline direction vector I_u stability is unreliable.



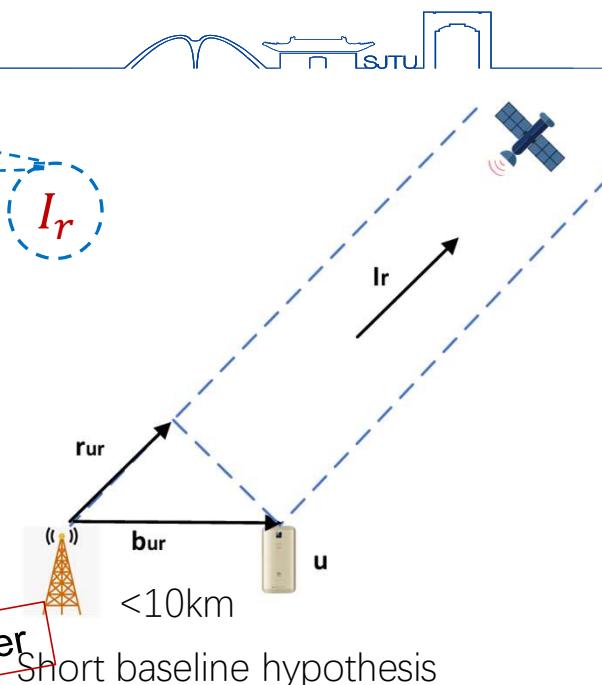
RTD+IMU Positioning Algorithm

- Difference Kalman Filter—Doppler

subtraction

$$\dot{\rho}_u - v^{(n)} \cdot I_u + \delta f^{(n)} - \zeta \rho_u = -v_u \cdot I_u + \delta f_u$$
$$\dot{\rho}_r - v^{(n)} \cdot I_r + \delta f^{(n)} - \zeta \rho_r = -v_r \cdot I_r + \delta f_r$$
$$\dot{\rho}_{ur}^{(n)} = -v_r \cdot I_r + c \delta f_{ur}$$

Common mode errors are calculated together



RTD+IMU Positioning Algorithm

- Difference Kalman Filter——Pseudorange

subtraction

$$\rho_u^{(n)} = r_u^{(n)} + \delta t_u - \delta t^{(n)} + I_u^{(n)} + T_u^{(n)} + \xi_{\rho u}^{(n)}$$

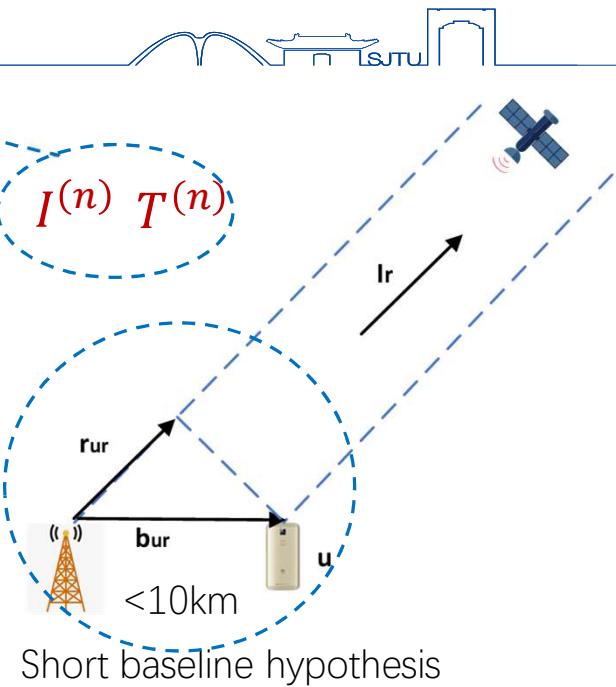
$$\rho_r^{(n)} = r_r^{(n)} + \delta t_r - \delta t^{(n)} + I_r^{(n)} + T_r^{(n)} + \xi_{\rho r}^{(n)}$$

$$\rho_{ur}^{(n)} = r_{ur}^{(n)} + c\delta t_{ur}$$

$$r_{ur}^{(n)} = -b_{ur} \cdot I_r$$

$$\rho_{ur}^{(n)} = -b_{ur} \cdot I_r + c\delta t_{ur}$$

Linearized the observation vector, extend kalman filter is no more needed.



RTD+IMU Positioning Algorithm

- Difference Kalman Filter——IMU

$$a_{enu} = R \times a_{body}$$

$$\hat{a}_k = a_{\overline{k-1}} + \delta a_{\overline{k-1}}$$

- **High update frequency**
- **High instantaneous accuracy**





RTD+IMU Positioning Algorithm

- Double Difference Kalman Filter

subtraction

$$\rho_{ur}^{(i)} = -b_{ur} \cdot I_r^{(i)} + c\delta t_{ur}$$
$$\rho_{ur}^{(j)} = -b_{ur} \cdot I_r^{(j)} + c\delta t_{ur}$$

J = max Angle satellite

$$\rho_{ur}^{(ij)} = -b_{ur} \cdot (I_r^{(i)} - I_r^{(j)})$$

$$\dot{\rho}_{ur}^{(ij)} = -V_r \cdot (I_r^{(i)} - I_r^{(j)})$$



Gnss clock drift

$$\begin{bmatrix} \mathbf{R}_{\text{sat}} \\ \mathbf{R}_{\mathbf{a}} \end{bmatrix} = \begin{bmatrix} \mathbf{C}^2 \cdot 10^{-\text{CNR}^{(i)}/10} \\ R_{ax} \\ R_{ay} \\ R_{az} \end{bmatrix}$$

CNR or Satellite angle are equivalent



RTD+IMU Positioning Algorithm

- Difference Kalman Filter——Updating matrix

$$\begin{bmatrix} b_{ur} \\ v \\ a \\ \delta a \end{bmatrix} = \begin{bmatrix} 1 & T_S & \frac{T_S^2}{2} & 0 \\ 0 & 1 & T_S & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \cdot \begin{bmatrix} b_{ur} \\ v \\ a \\ \delta a \end{bmatrix}$$

$$P_{\bar{k}} = A_c P_{k-1} A^T + Q$$

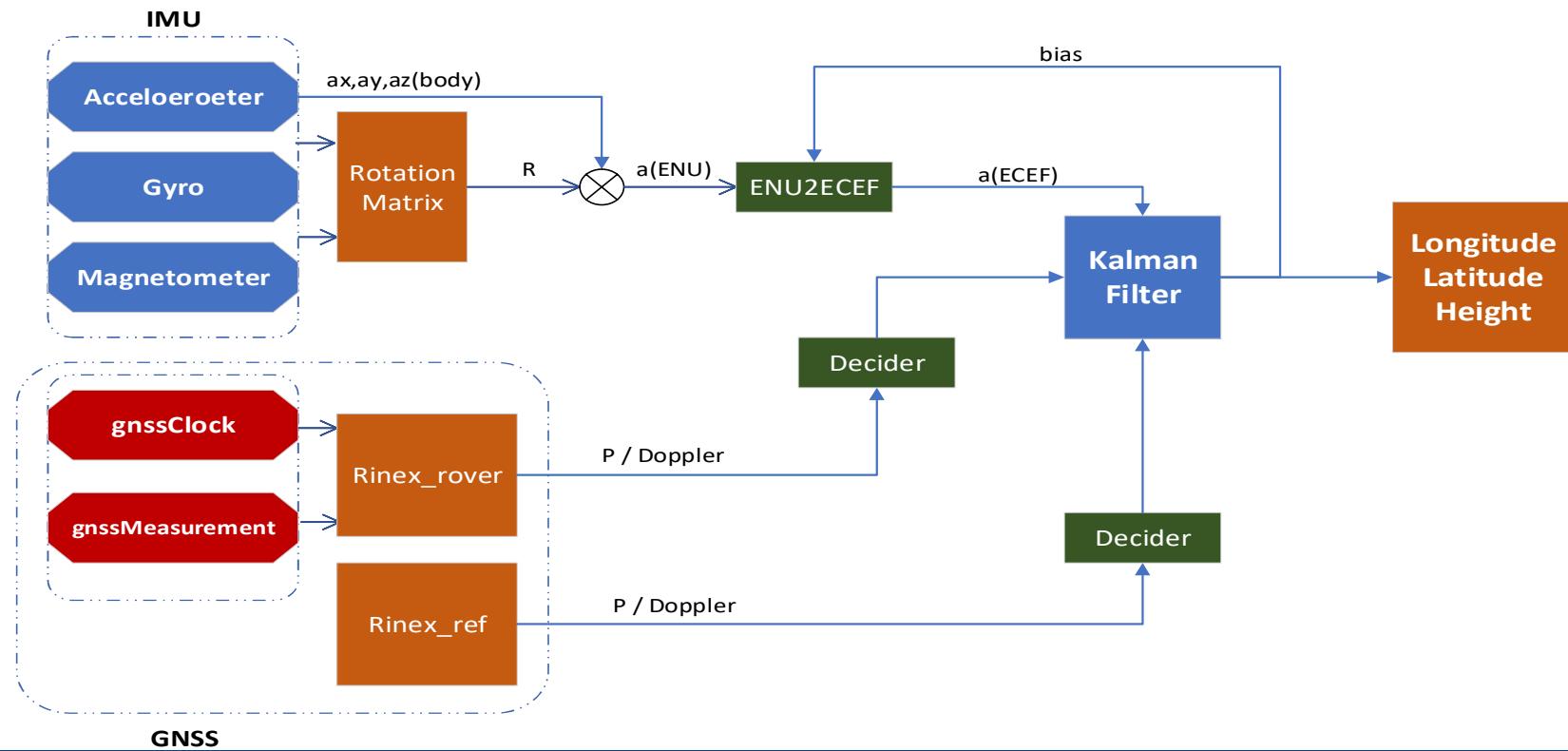
$$\mathbf{Q} = \begin{bmatrix} Q_p & 0 \\ 0 & Q_a \end{bmatrix}$$

$$\mathbf{Q}_p = \begin{bmatrix} S_x T_S + S_v \frac{T_S^3}{3} + S_a \frac{T_S^5}{20} & S_v \frac{T_S^2}{2} + S_a \frac{T_S^4}{8} & S_a \frac{T_S^3}{6} \\ S_v \frac{T_S^2}{2} + S_a \frac{T_S^4}{8} & S_v T_S + S_a \frac{T_S^3}{3} & S_a \frac{T_S^2}{2} \\ S_v \frac{T_S^3}{6} & S_v \frac{T_S^2}{2} & S_a T_S \end{bmatrix}$$

Assuming that the noises are independent of each other, the autocorrelation function with impulse response

RTD+IMU Positioning Algorithm

▪ System Framework



A faint, semi-transparent background image of a traditional Chinese building with a curved roof, red columns, and blue tiles. There are also some decorative elements like a dragon statue and a blue eye-shaped ornament.

1

Introduction & Motivation

2

RTD+IMU Positioning Algorithm

3

Experiment Architecture

4

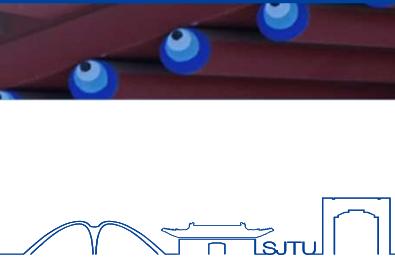
Result and Analysis

5

Conclusion & Future Works



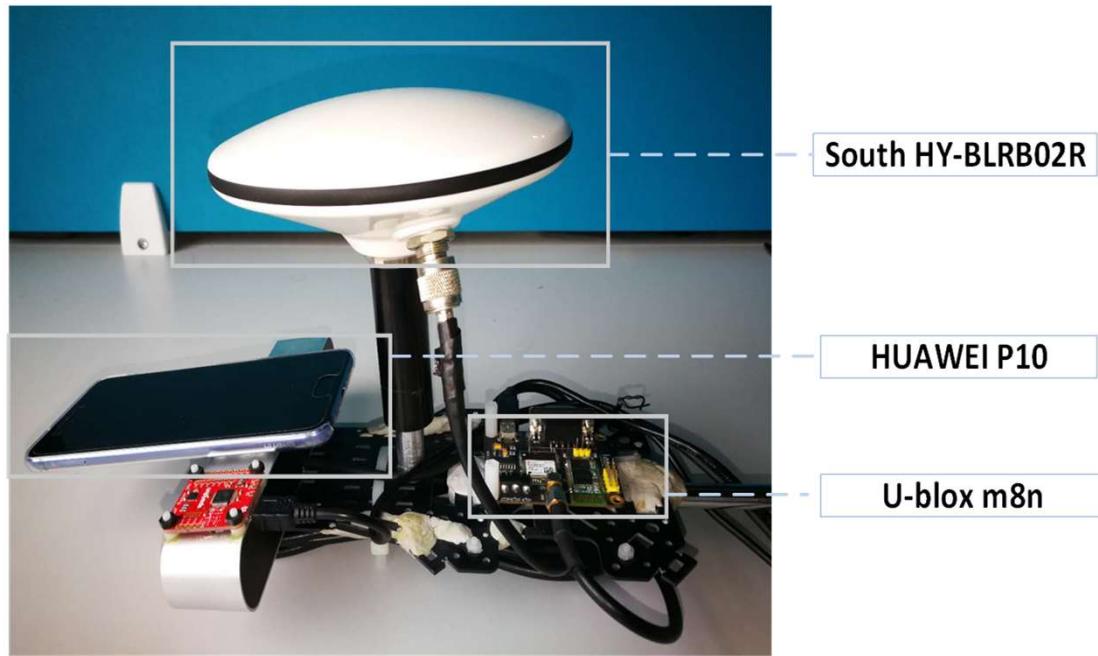
上海交通大学
SHANGHAI JIAO TONG UNIVERSITY



Experiment Architecture

- System setup

Handheld platform

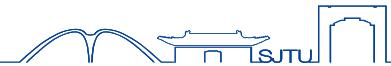


HUAWEI P10





Experiment Architecture



- Experiment environment

Static



Kinematic



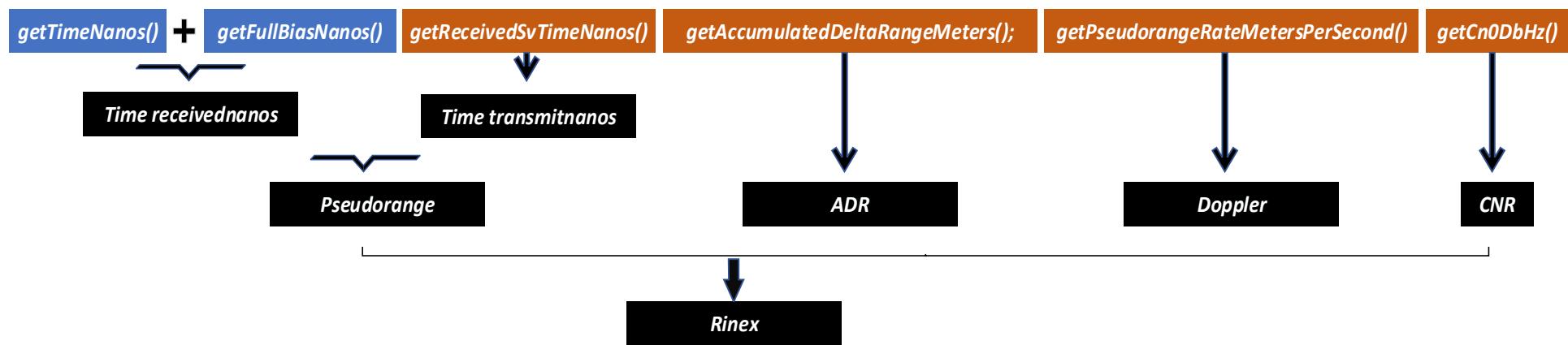
Blockage



Experiment Architecture



- RINEX generation



- `getPseudorangeRateUncertaintyMetersPerSecond() < 10 & getReceivedSvTimeUncertaintyNanos() < 500`
- Pseudorange value $> 1e7$ & Pseudorange $< 3e7$
- Satellite angle > 15 degree & CNR > 15 dB
- Max position movement per epoch $< 10m$

Threshold



1

Introduction & Motivation

2

RTD+IMU Positioning Algorithm

3

Experiment Architecture

4

Result and Analysis

5

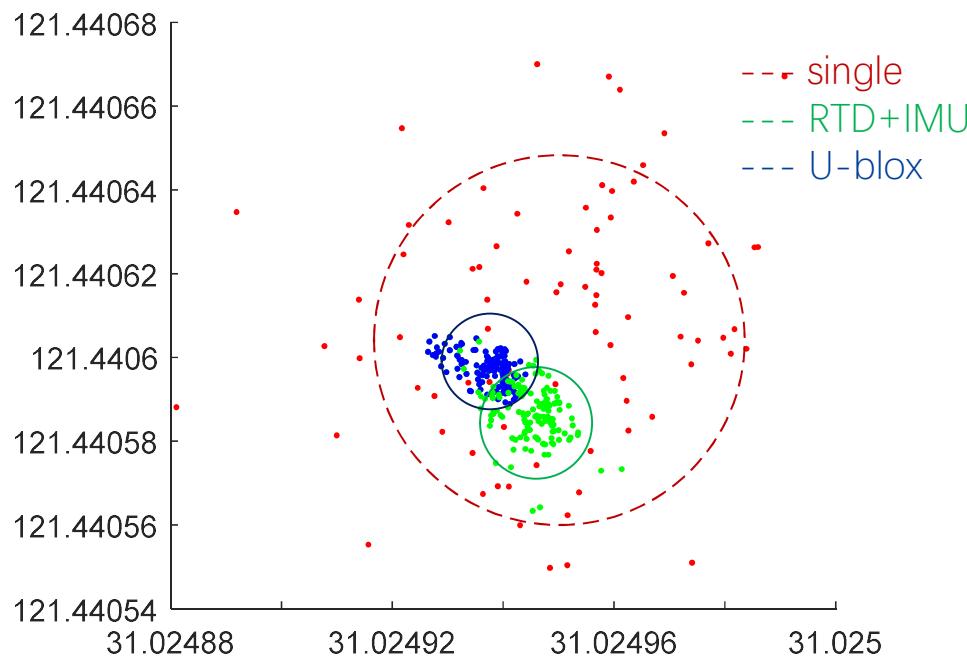
Conclusion & Future Works



上海交通大学
SHANGHAI JIAO TONG UNIVERSITY

Result and Analysis

- Static



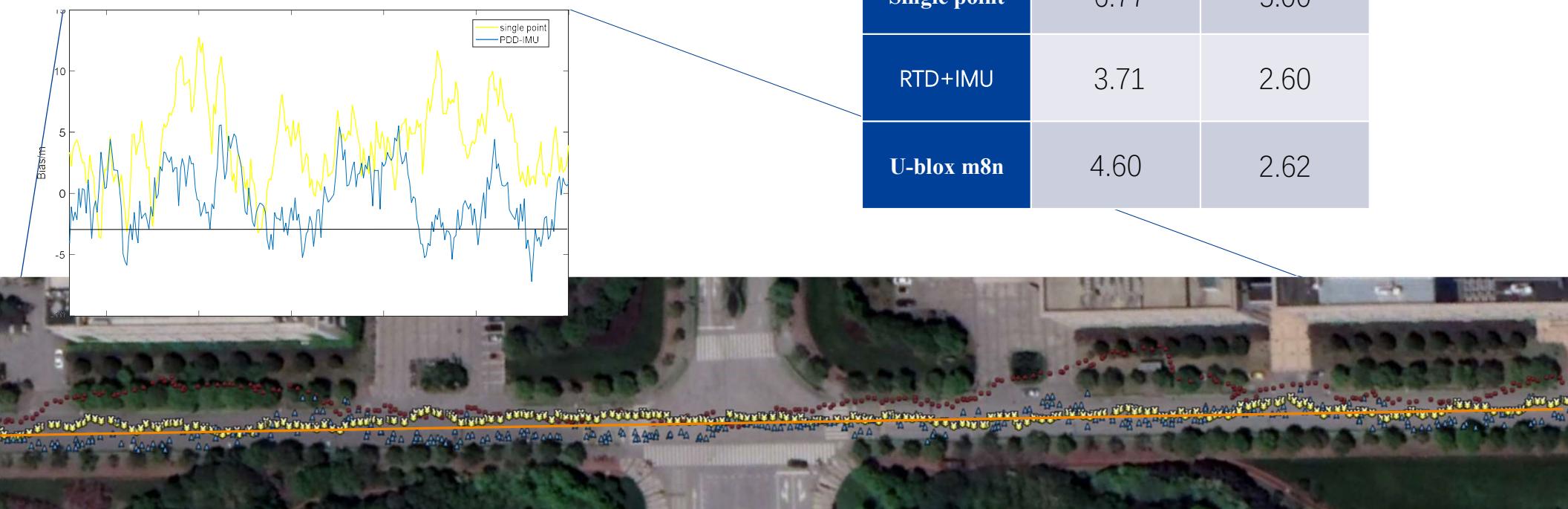
Horizontal error	Mean error (m)	STD (m)
Single point	4.51	9.57
RTD	4.11	3.99
U-blox	3.88	3.74



Result and Analysis

▪ Kinematic

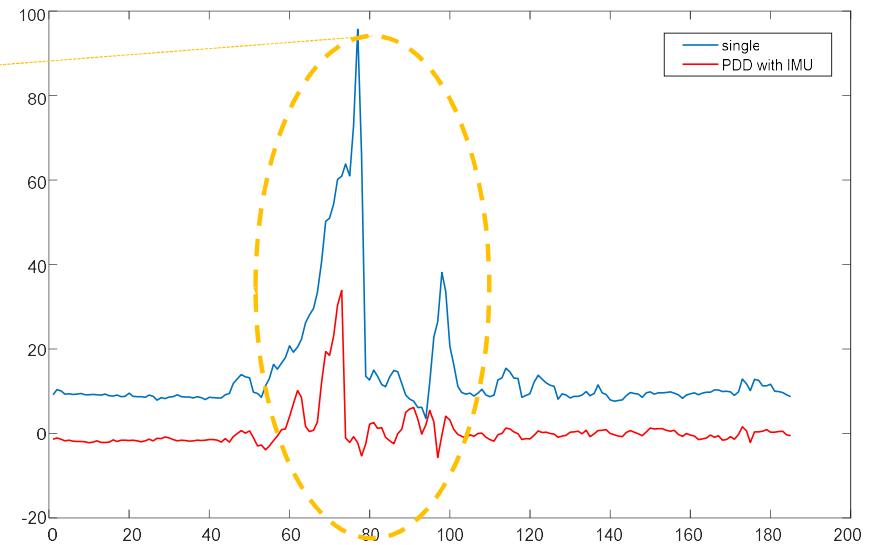
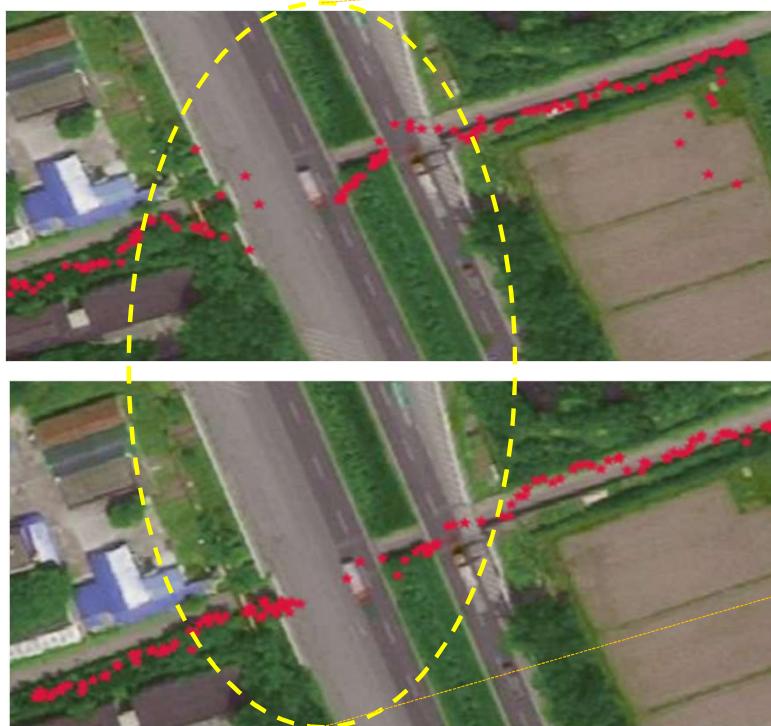
Horizontal error	Mean error (m)	STD (m)
Single point	6.77	5.00
RTD+IMU	3.71	2.60
U-blox m8n	4.60	2.62





Result and Analysis

- **Blockage**



- **Calibrate the fixed error**
- **Release the drastic drift when GNSS signal blocked**



1

Introduction & Motivation

2

Double Difference Model

3

Experiment Architecture

4

Result and Analysis

5

Conclusion & Future Works



上海交通大学
SHANGHAI JIAO TONG UNIVERSITY

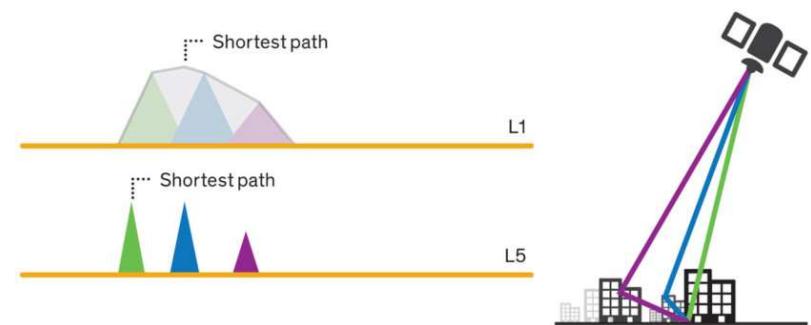
Conclusion & Future Works

▪ Conclusion

- PDD model was presented and clarified the advantages than traditional solutions
- IMU of smartphone enable to assist GNSS performance, but its stability is unreliable.
- MEMS-based IMU assisted RTD increases smartphone positioning precision and robustness, and the mean accuracy can be less than 3 meters.

▪ Future Works

- GNSS new fusion way
- Multi-frequency.



Thanks



Q&A