

The background of the slide features a large, faint watermark of the University of Otago crest, which includes a bearded man's head and a circular emblem with a sun and a bird.

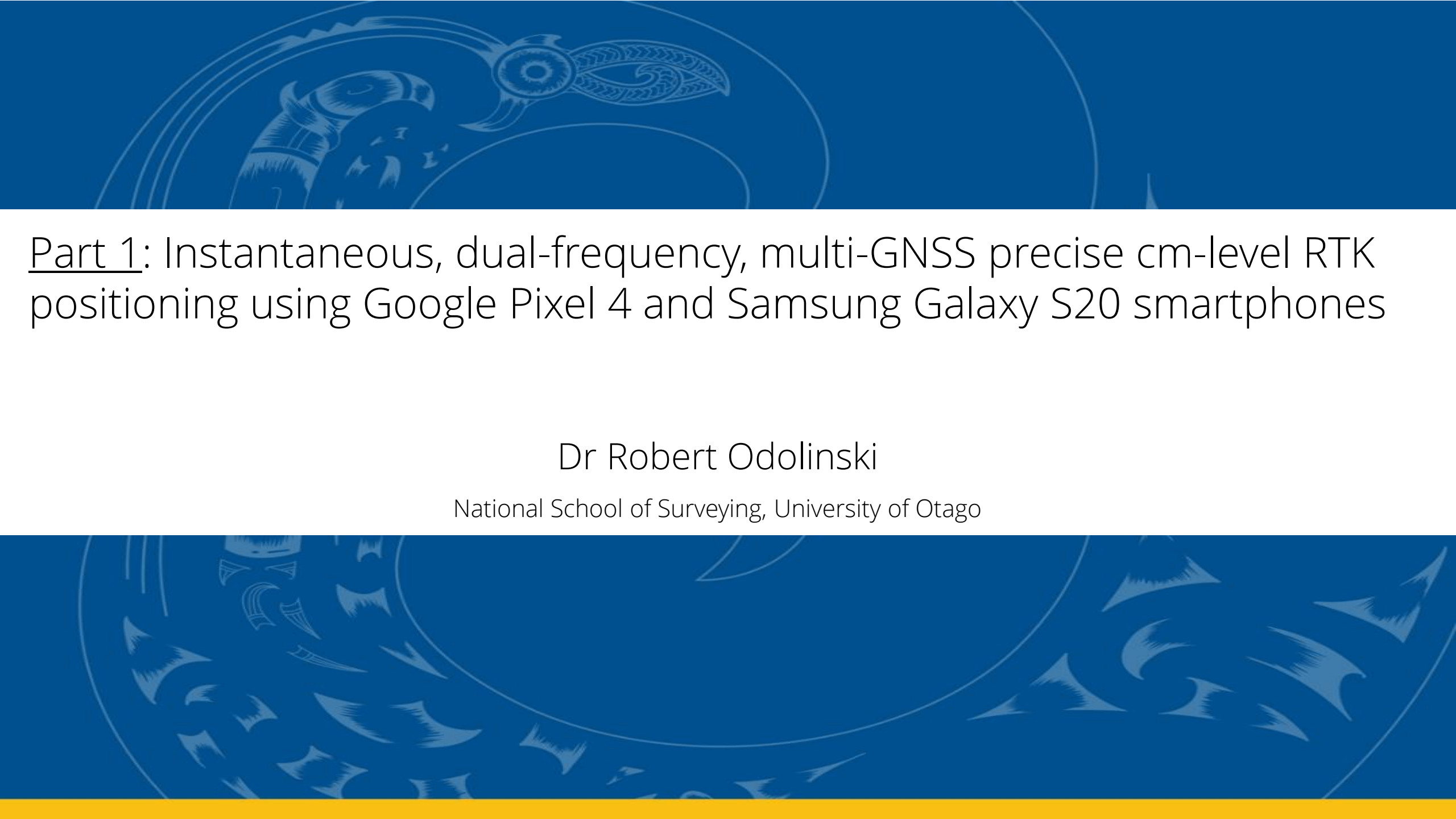
Precise GNSS positioning with Android smartphones and on the use of the best integer equivariant estimator

Part 1: Instantaneous cm-level RTK positioning using Google Pixel 4 and Samsung Galaxy S20 smartphones

Part 2: RTK positioning for some recent Android smartphones (Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22)

Dr Robert Odolinski

National School of Surveying, University of Otago

The background of the slide features a large, faint watermark of the University of Otago crest. The crest is circular and contains a central figure, likely a Native Māori, surrounded by various symbols and text. The watermark is rendered in a light blue color against the dark blue background.

Part 1: Instantaneous, dual-frequency, multi-GNSS precise cm-level RTK positioning using Google Pixel 4 and Samsung Galaxy S20 smartphones

Dr Robert Odolinski

National School of Surveying, University of Otago

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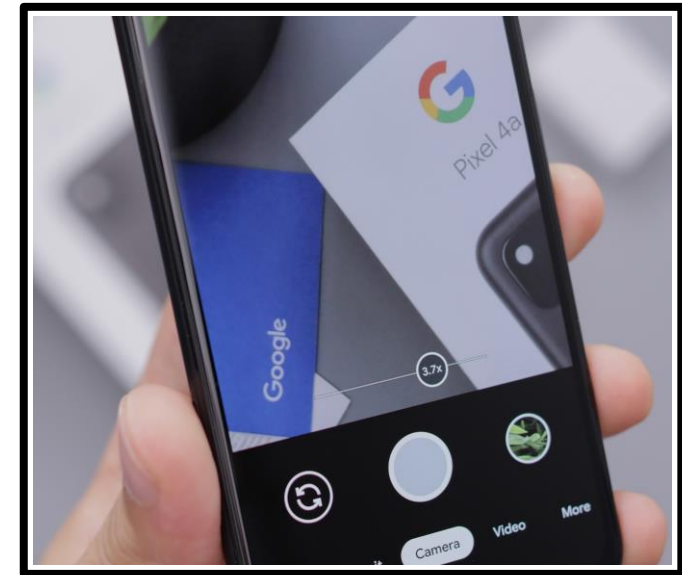
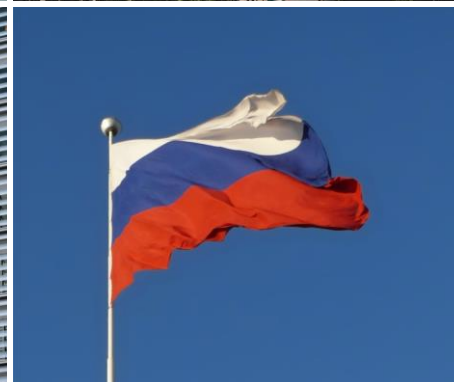
Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.

Dual-frequency and multi-GNSS necessary for successful cm-level smartphone (RTK) positioning

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.



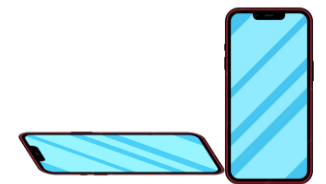
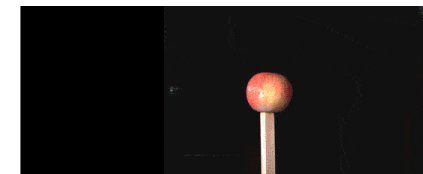
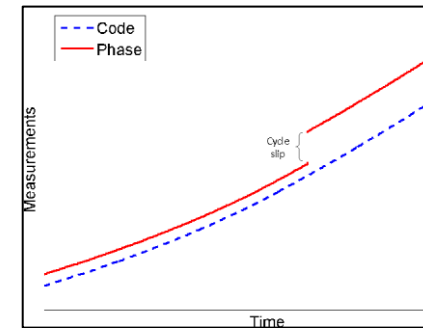
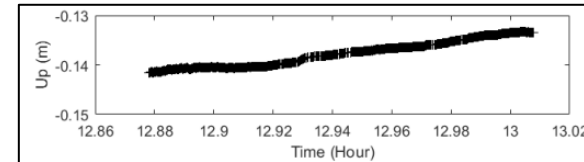
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Research motivation

1. All studies on mass-market smartphone data have had issues with integer ambiguity resolution, and some researchers show only small time periods of data with successful cm-level positioning using L1 GPS only (Paziewski et al., 2021; Hesselbarth & Wanninger, 2020).
 - We will show results for up to 12 hours of data using multi-GNSS and dual-frequency data, as collected by two of the newest mass-market smartphones at the time of publication.
2. All studies have used multi-epoch models whereby the unknown parameters are linked in time, making the model stronger.
 - We will use the weaker single-epoch model, but with the added benefit that it becomes insensitive to cycle slips (which are highly present for smartphone antennas).
3. As a consequence of 2 above all studies have required a convergence time for cm-level positioning (typically tens of minutes).
 - We will show instantaneous (single-epoch) cm-level positioning capability for smartphone data.
4. Most (almost all) studies have not considered the orientation of the smartphone antenna.
 - As an unexpected but significant finding of our study, we found that the orientation of the smartphone (antenna) will significantly affect the ambiguity resolution results (more to come...).

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

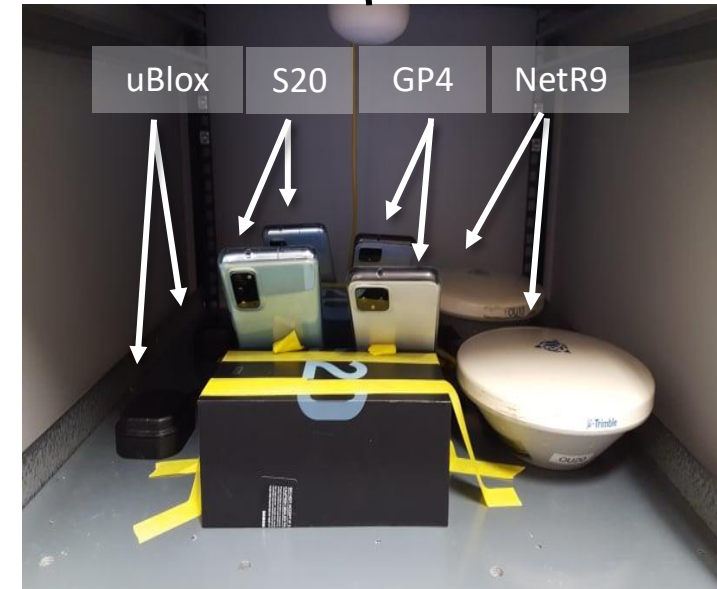
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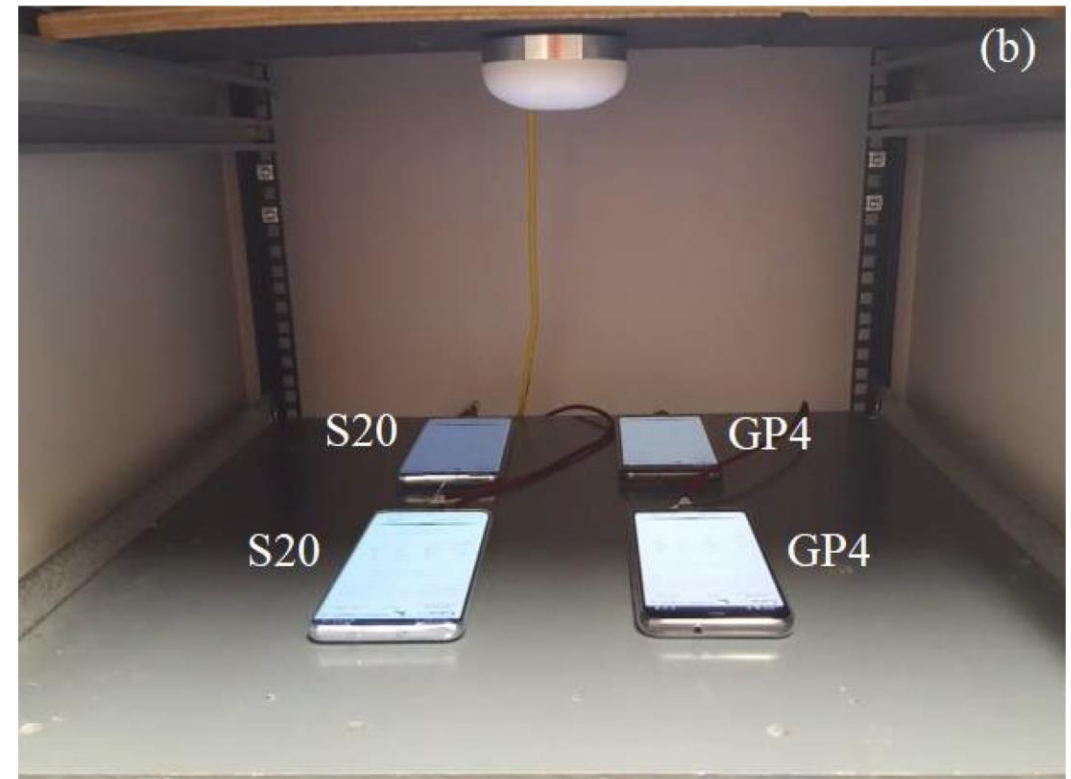
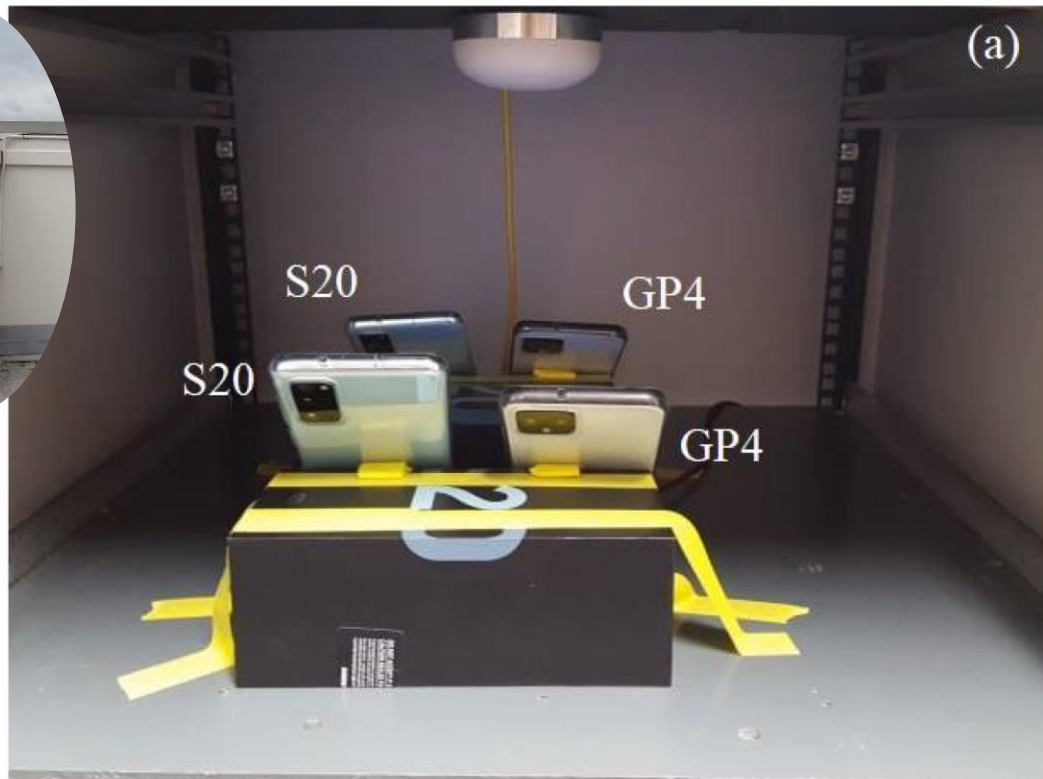
Low-cost & smartphone receivers



Samsung Galaxy S20	G, E, J, C	L1+L5, E1 + E5a, L1 + L5, B1
Google Pixel 4	G, E, J, C	L1+L5, E1 + E5a, L1 + L5, B1
μBlox F9P	G, E, J, C	L1+L2, E1 + E5b, L1 + L2, B1 + B2
Trimble NetR9	G, E, J, C	L1+L2, E1 + E5b, L1 + L2, B1 + B2 + B3



Setup Configurations (1), ZBL external antenna



Zero-baseline (ZBL) setup configurations for smartphones in (a) upright and (b) lying down positions. The re-radiating antenna receives the GNSS signals through the roof-top antenna

Integer Least Squares (ILS)

The single-baseline RTK functional model can be given as,

$$E(y) = Aa + Bb, \quad a \in \mathbb{Z}^n, b \in \mathbb{R}^p \quad (1)$$

where $E(\cdot)$ is the expectation operator, y the vector of code and phase observations, a is the vector of unknown integer ambiguities, and b vector of real-valued coordinate components (and for sufficiently long baselines, it also includes ionospheric and tropospheric delays). The design matrices A and B are assumed to be of full rank.

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.

Integer Least Squares (ILS)

1) Firstly assume $a \in \mathbb{R}^n$ and perform a least-squares adjustment, to obtain the 'float solution', denoted with a 'hat', and its (co)variance matrices,

$$\begin{bmatrix} \hat{a} \\ \hat{b} \end{bmatrix}, \begin{bmatrix} Q_{\hat{a}\hat{a}} & Q_{\hat{a}\hat{b}} \\ Q_{\hat{b}\hat{a}} & Q_{\hat{b}\hat{b}} \end{bmatrix} \quad (2)$$

Float

2) Secondly decorrelate ambiguities through the LAMBDA method $\hat{z} = Z^T \hat{a}$ to obtain an almost diagonal variance matrix $Q_{\hat{z}\hat{z}} = Z^T Q_{\hat{a}\hat{a}} Z$. We then find the **single** integer candidate vector through an integer search that minimizes the weighted squared norm,

$$\arg \min_{z \in \mathbb{Z}^n} \|\hat{z} - z\|_{Q_{\hat{z}\hat{z}}}^2 \quad (3)$$

3) where $\|\cdot\|_{Q_{\hat{z}\hat{z}}}^2 = (\cdot)^T Q_{\hat{z}\hat{z}}^{-1} (\cdot)$. Finally we transform $\check{a} = Z^{-T} \check{z}$ and compute the fixed **ILS** baseline solution \check{b} , denoted with 'check', and its variance matrix,

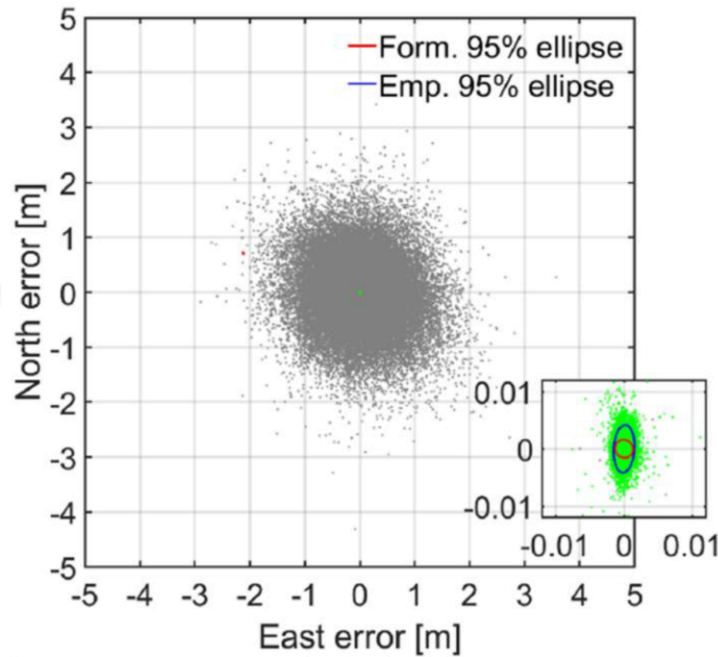
$$\check{b} = \hat{b} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} (\hat{a} - \check{a}), \quad Q_{\check{b}\check{b}} = Q_{\hat{b}\hat{b}} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} Q_{\hat{a}\hat{b}} \quad (4)$$

Fixed ILS

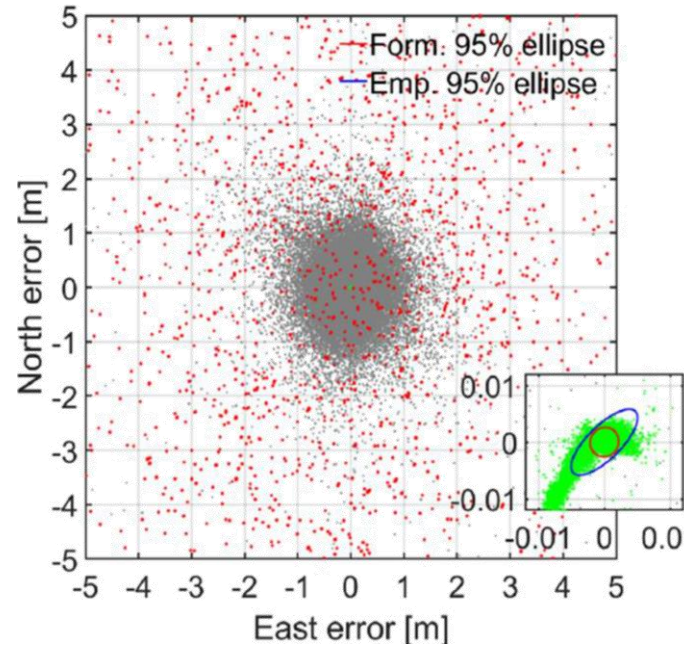
ZBL – Lying down position



GP4



S20



GP4 ILS SR: 99.9%
(0.1% incorrectly fixed)

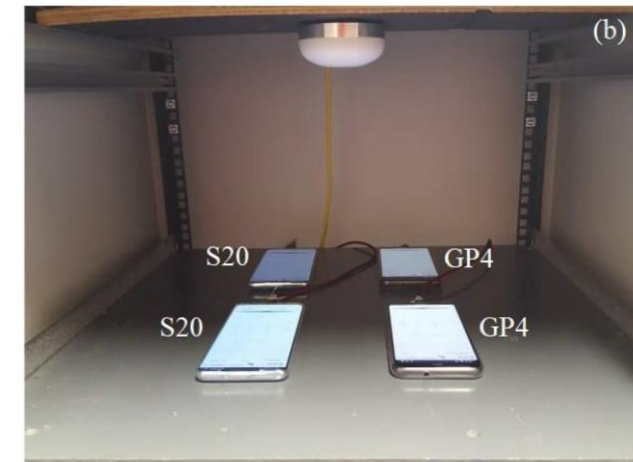
Mean \pm STDs m E 0.000 \pm 0.001 m
 (correctly fixed): N 0.000 \pm 0.002 m
 U -0.008 \pm 0.003 m

ILS (Integer Least Squares) Success Rate (SR) is the probability of correct integer estimation

S20 ILS SR: 79.4%
(20.6% incorrectly fixed)

Mean \pm STDs m E 0.000 \pm 0.002 m
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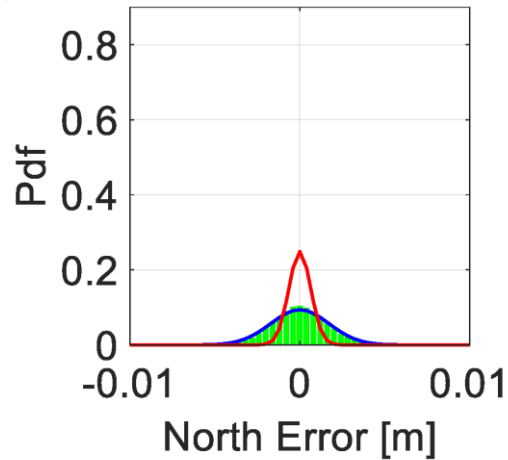
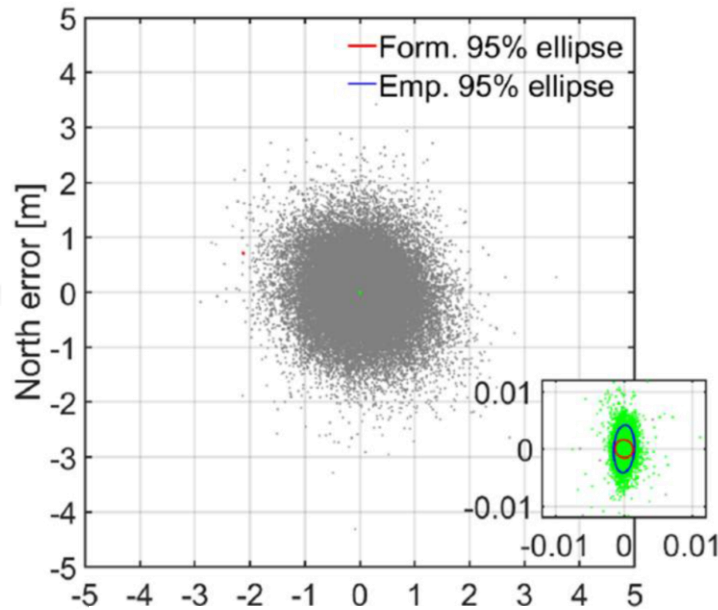
- \hat{b} = Float solution, i.e. $a \in \mathbb{R}^n$
- $\check{b} = \hat{b} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} (\hat{a} - \check{a})$ Fixed solution
- \check{b} when a incorrectly fixed.



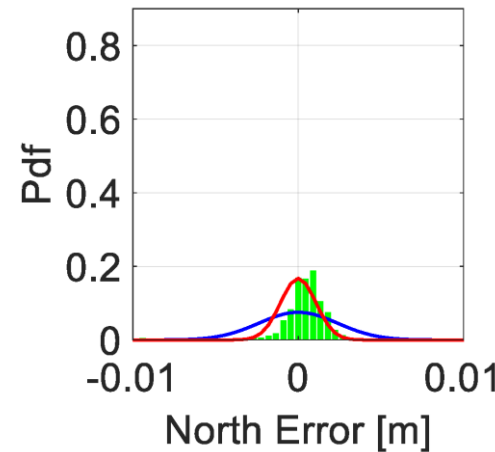
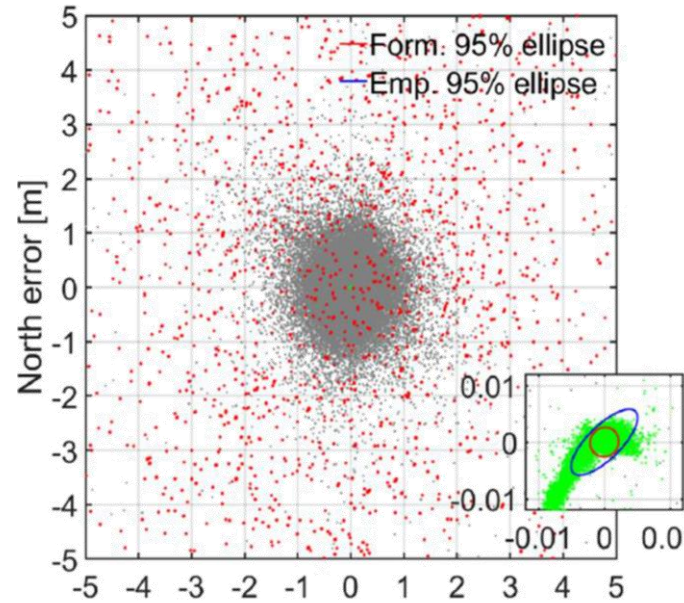
ZBL – Lying down position



GP4



S20



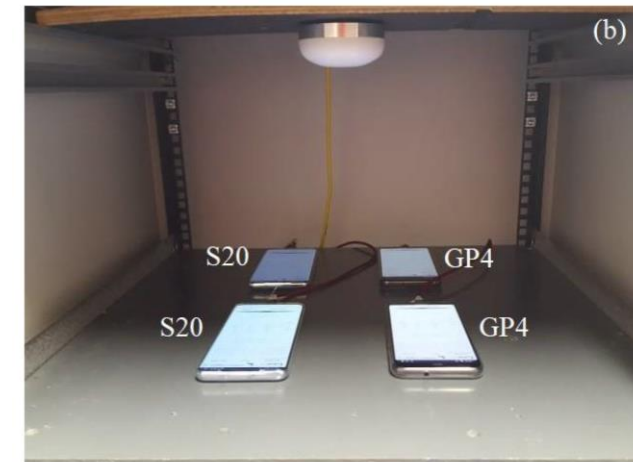
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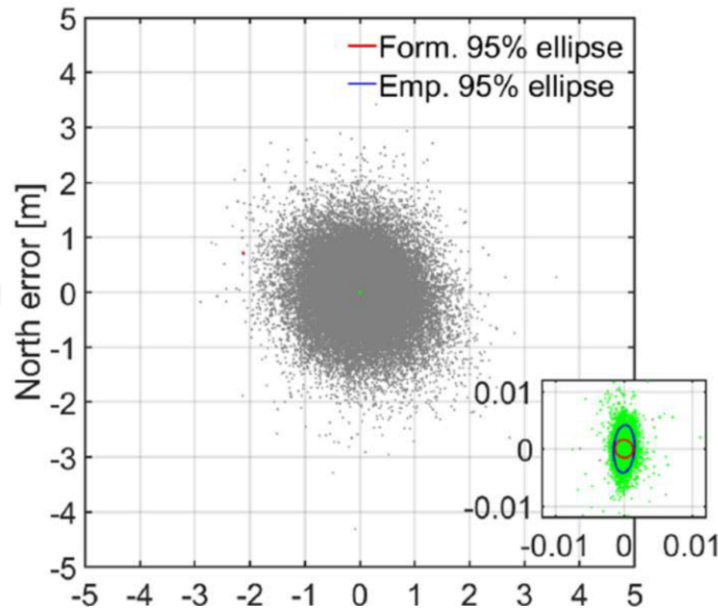
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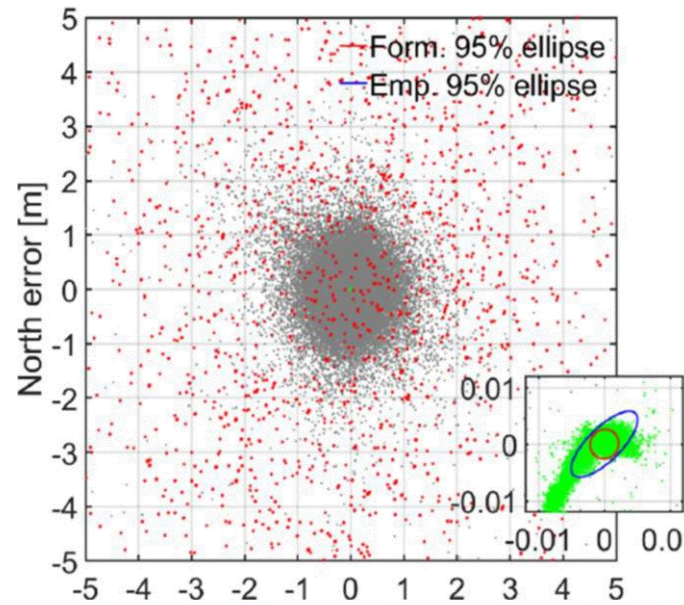
ZBL – Lying down position



GP4



S20



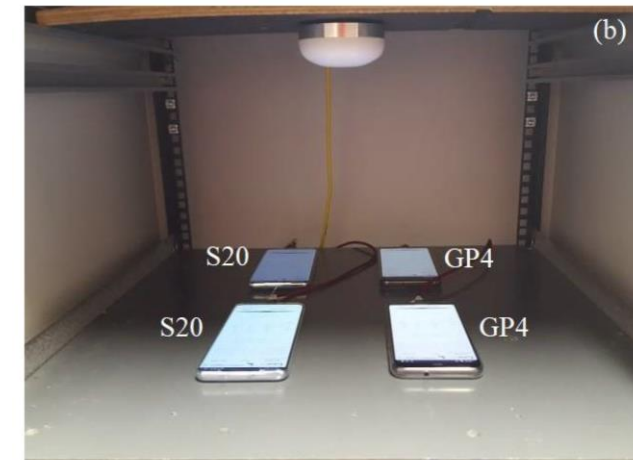
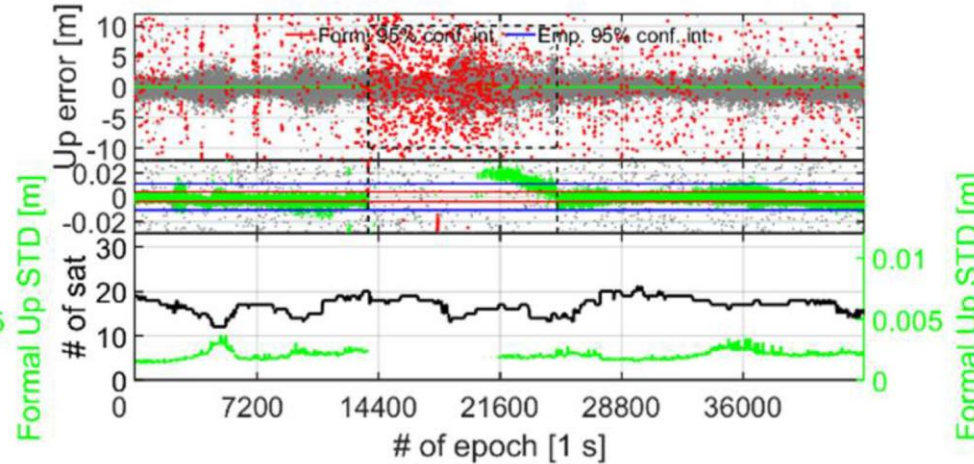
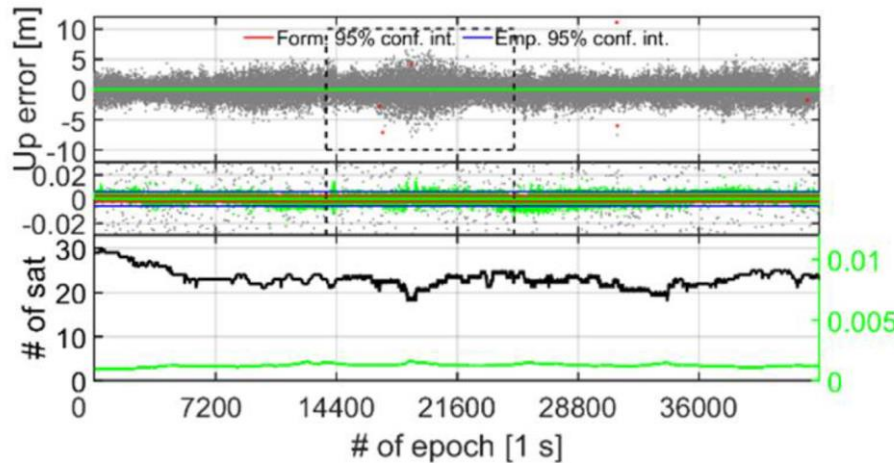
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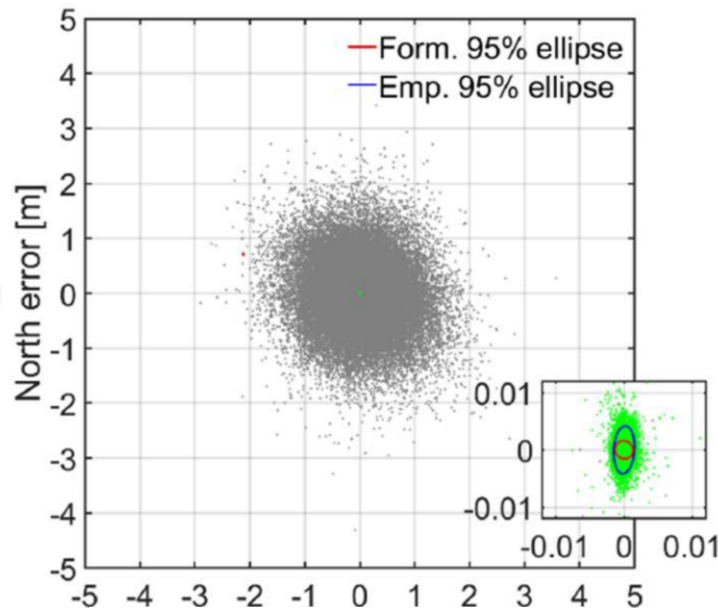
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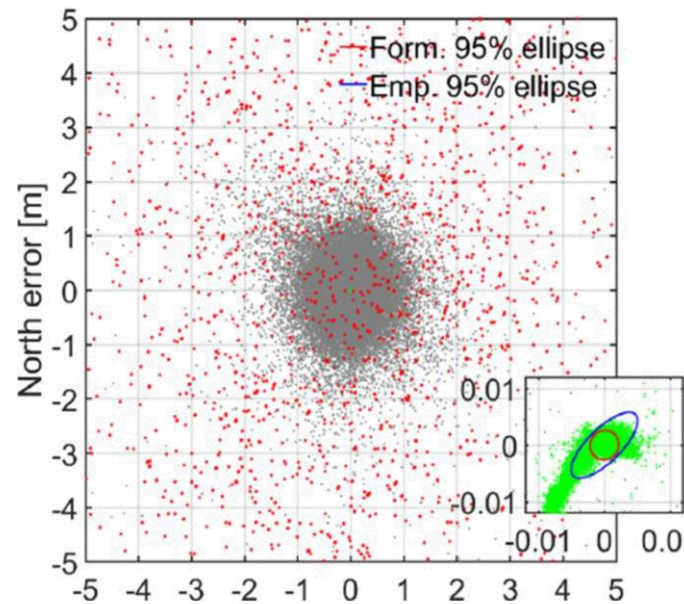
ZBL – Lying down position



GP4



S20



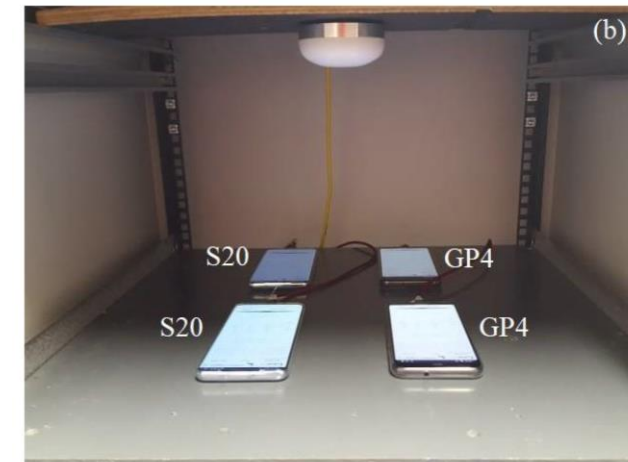
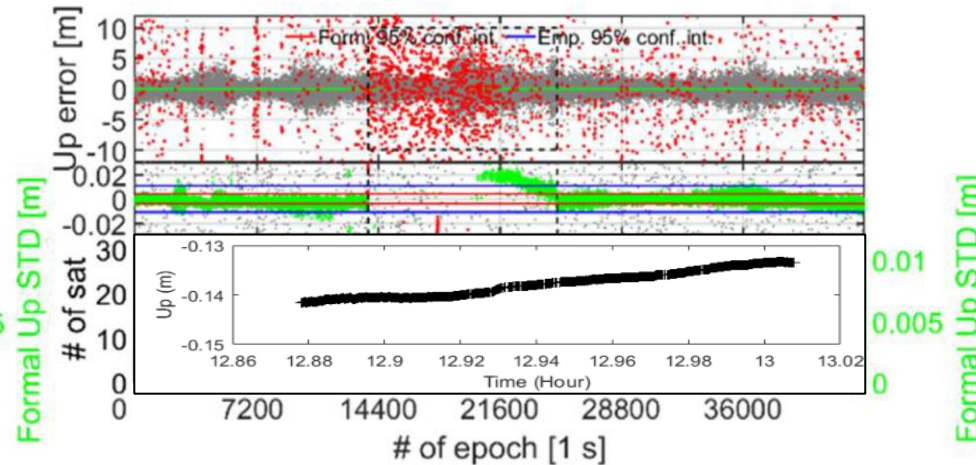
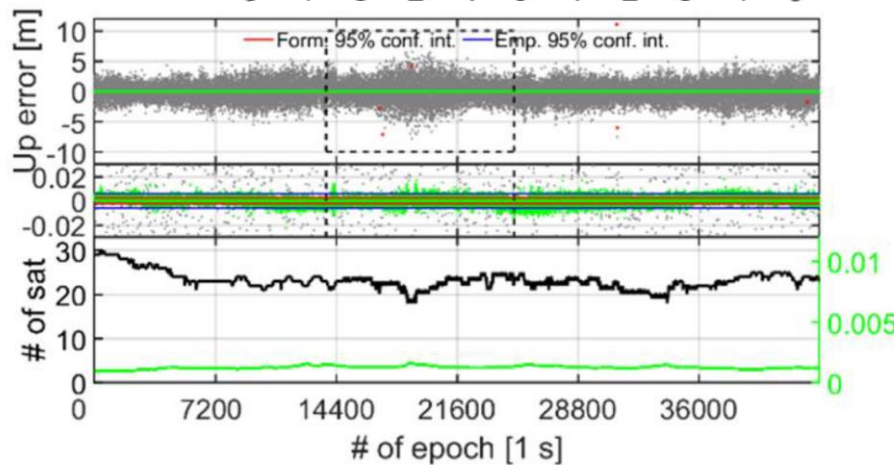
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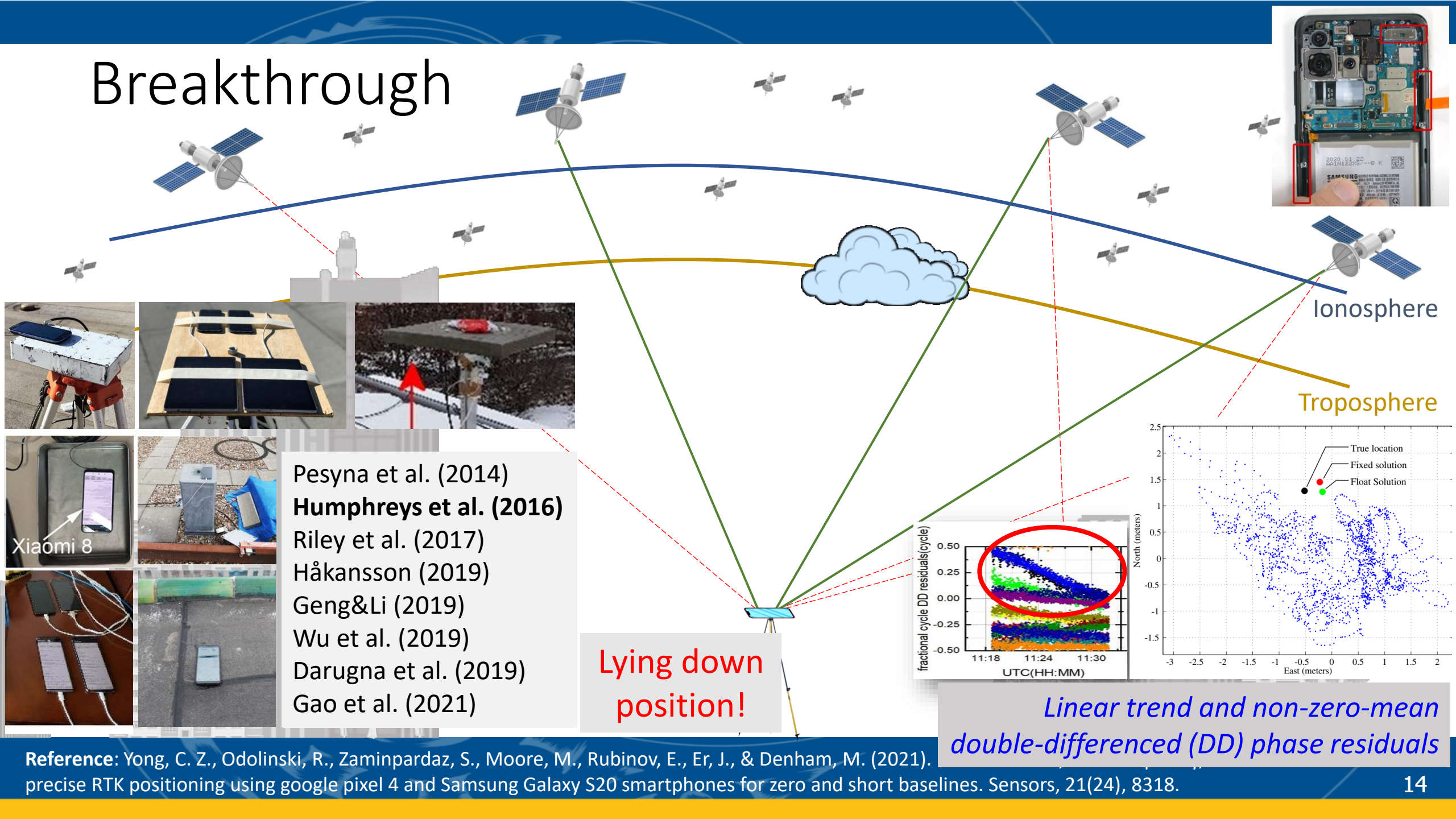
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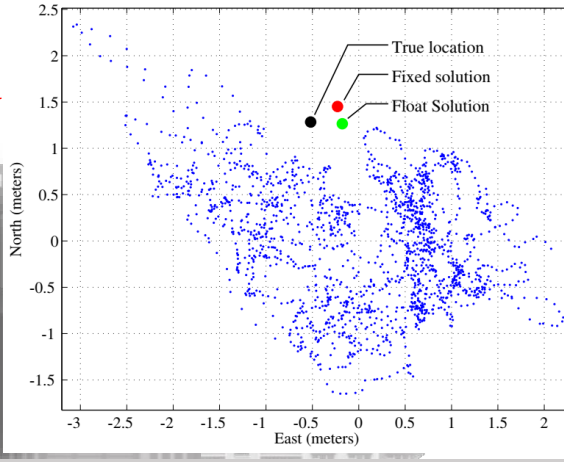
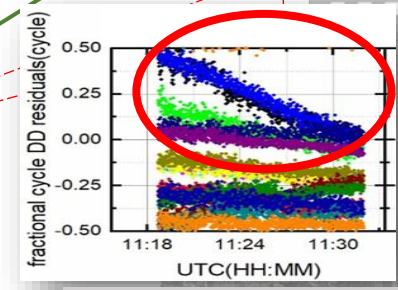
Breakthrough



- Pesyna et al. (2014)
- Humphreys et al. (2016)**
- Riley et al. (2017)
- Håkansson (2019)
- Geng&Li (2019)
- Wu et al. (2019)
- Darugna et al. (2019)
- Gao et al. (2021)

Lying down position!

Ionosphere
Troposphere

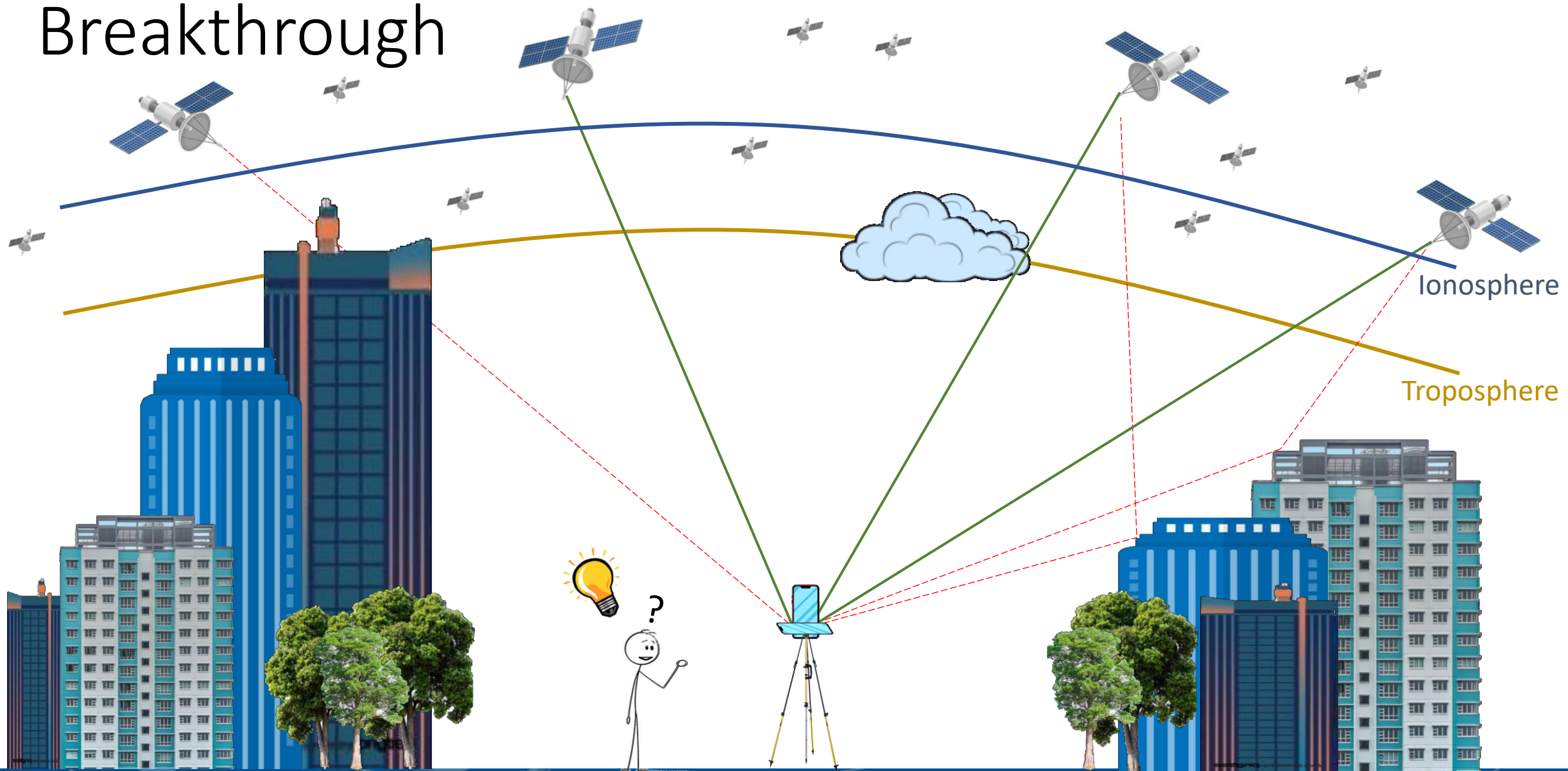


Linear trend and non-zero-mean double-differenced (DD) phase residuals

Reference: Yong, C. Z., Odolinski, R., Zaminpardaz, S., Moore, M., Rubinov, E., Er, J., & Denham, M. (2021).

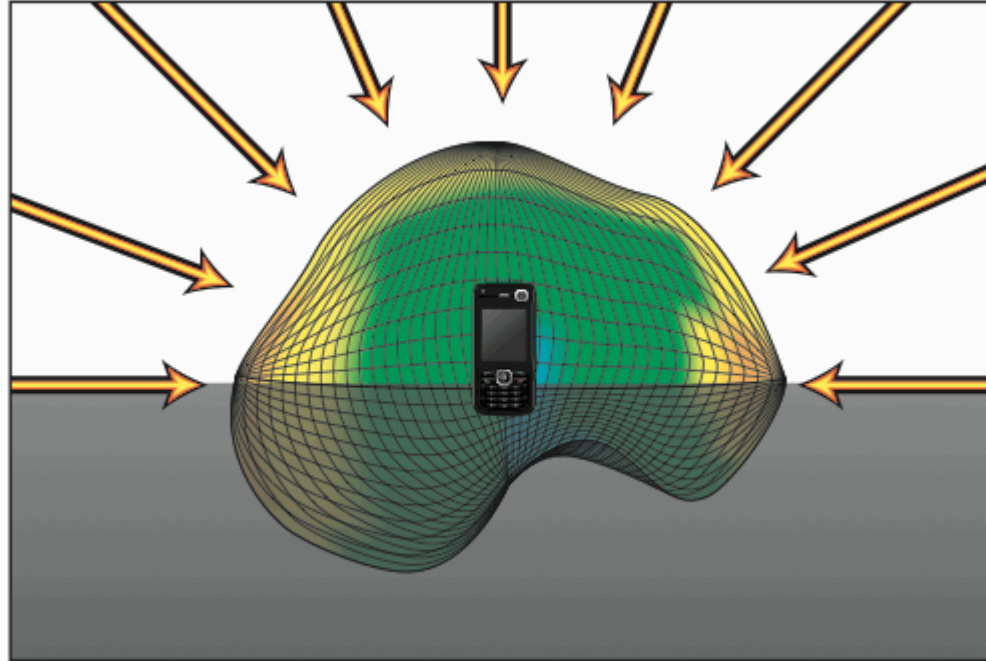
precise RTK positioning using google pixel 4 and Samsung Galaxy S20 smartphones for zero and short baselines. Sensors, 21(24), 8318.

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Antenna design



GNSS antennas in smartphones are generally constructed for the phone to be oriented upright (portrait mode)

Reference: <https://www.antenna-theory.com/design/gps.php>, viewed 09/11/2023

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

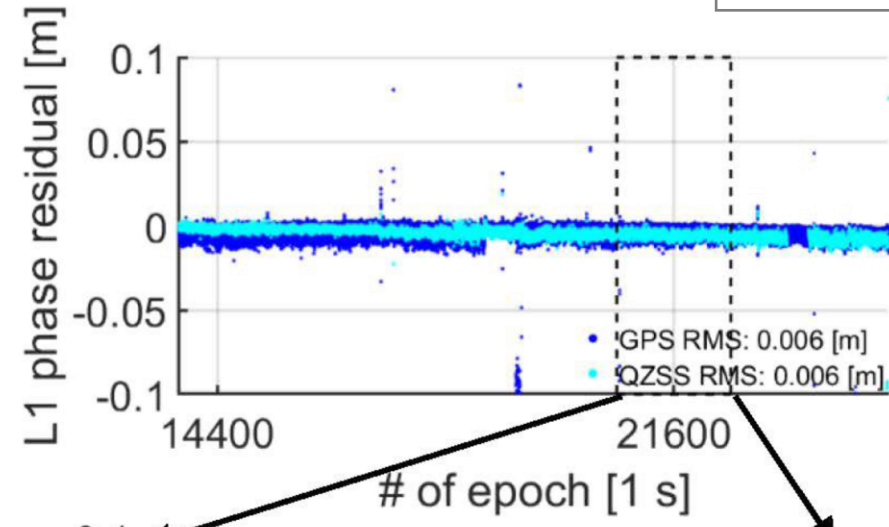
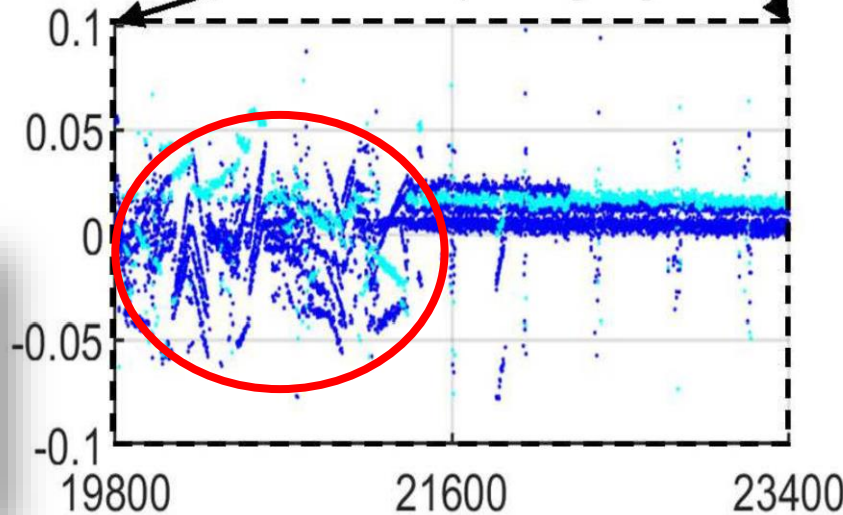
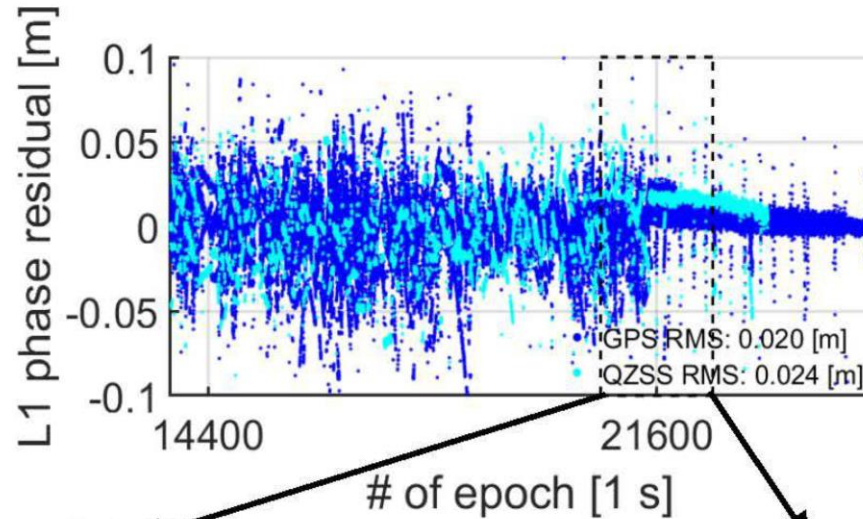
Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.

Phase Residual (Samsung S20)

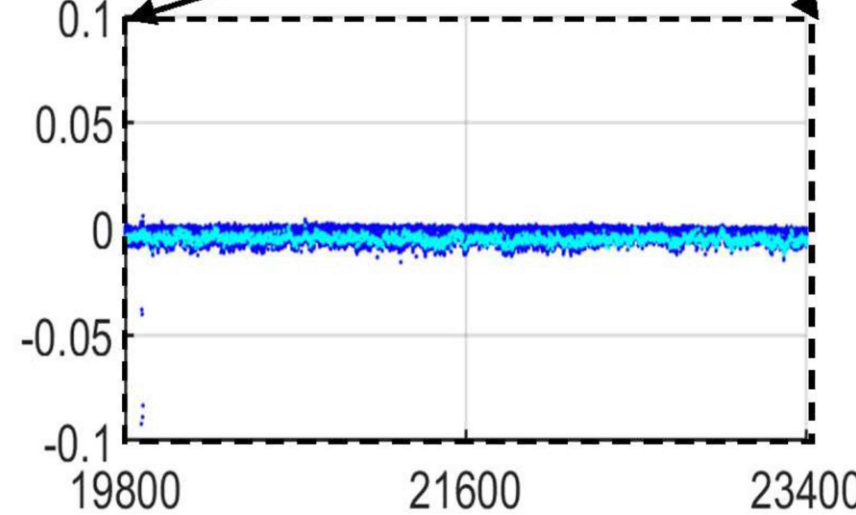
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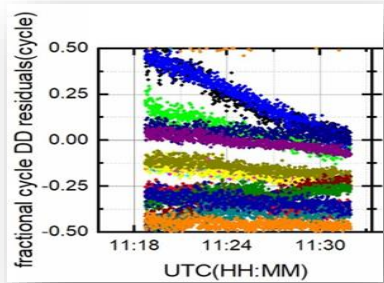
Lying down



Upright



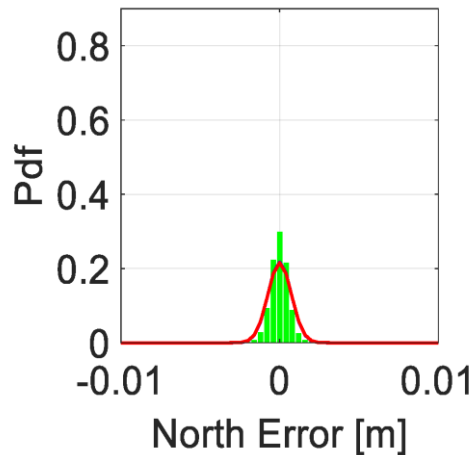
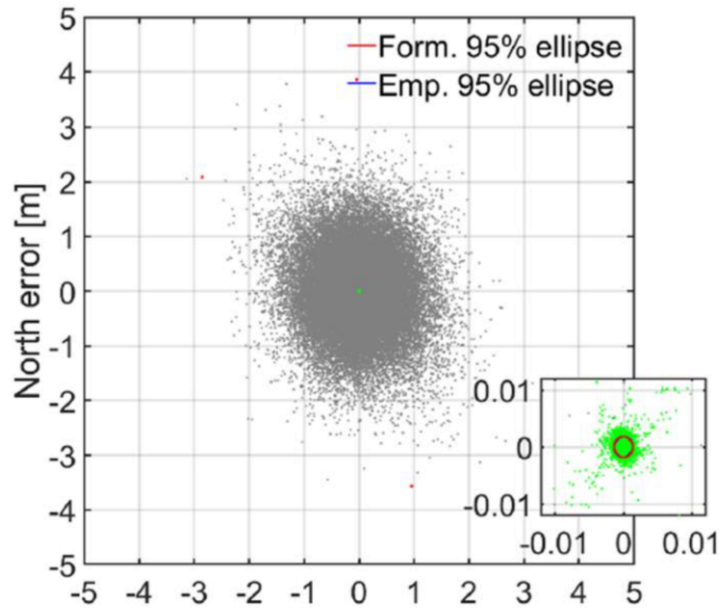
No linear trend
and zero-mean
DD phase
residuals



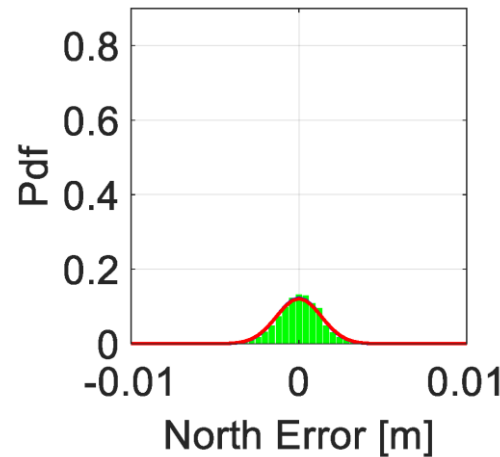
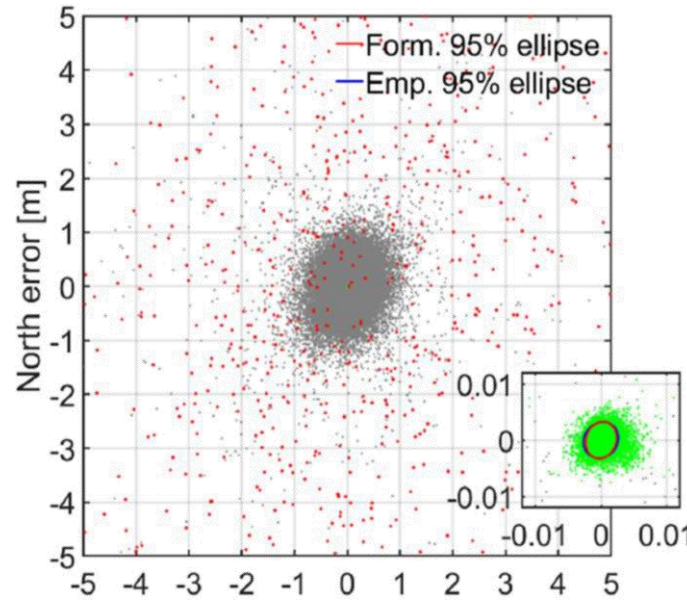
ZBL – Upright position



GP4



S20



GP4 ILS SR: 99.9%

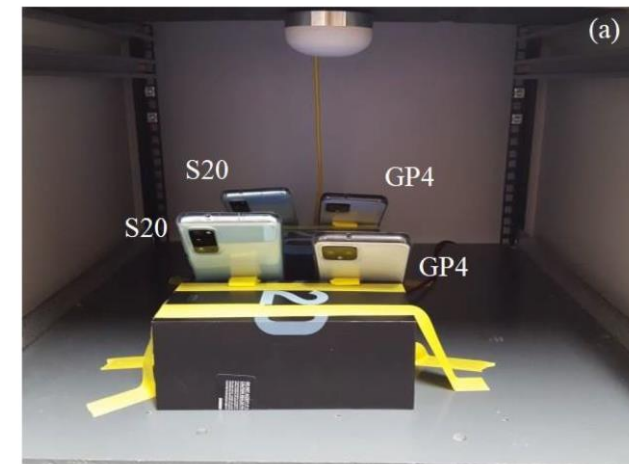
(0.1% incorrectly fixed)

Mean \pm STDs m
 (correctly fixed):
 E 0.000 ± 0.001 m
 N 0.000 ± 0.001 m
 U 0.004 ± 0.003 m

S20 ILS SR: 97.8% (lying down 79.4%)

(2.2% incorrectly fixed)

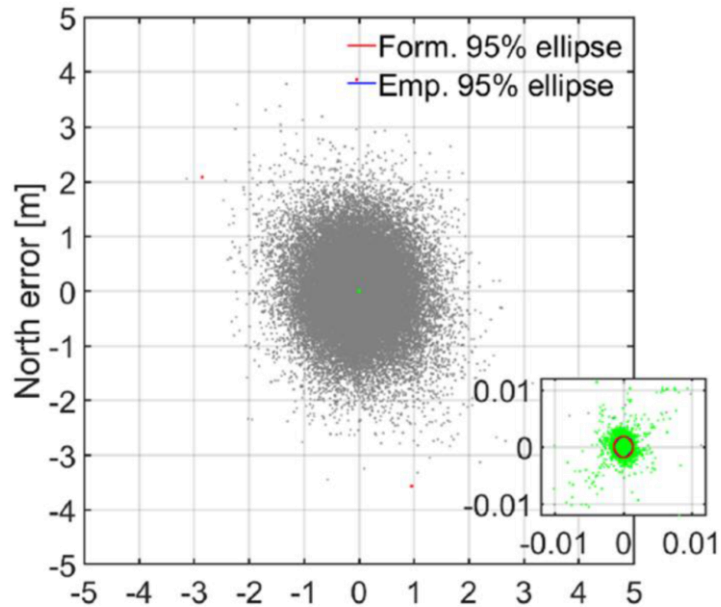
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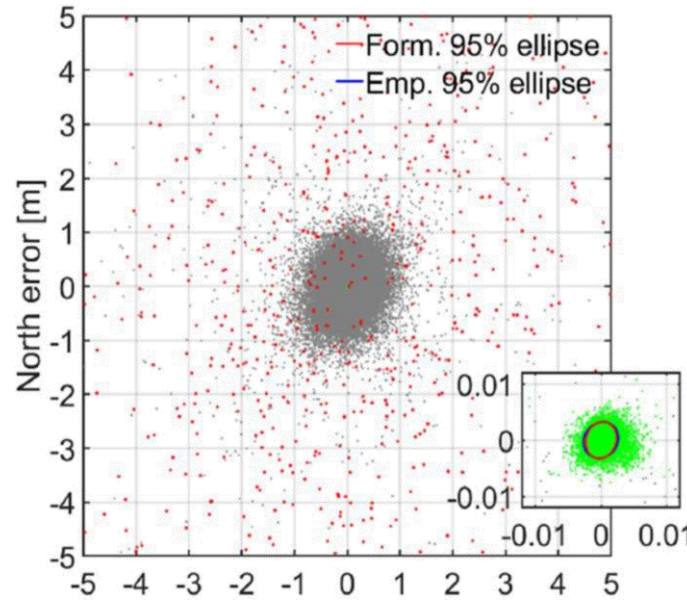
ZBL – Upright position



GP4



S20



GP4 ILS SR: 99.9%

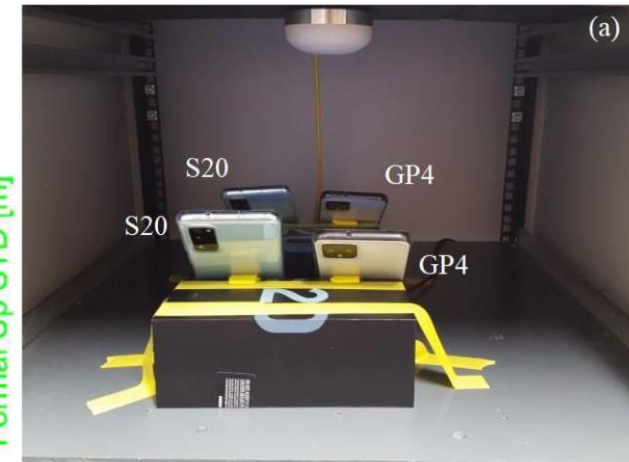
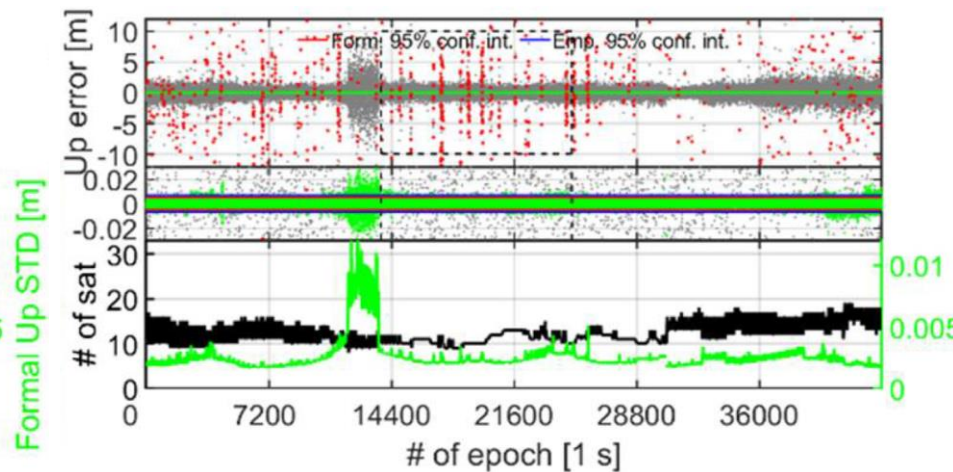
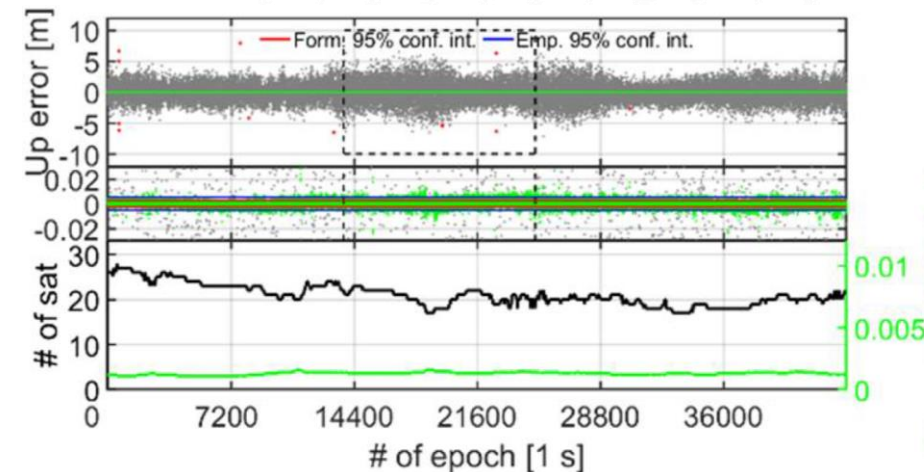
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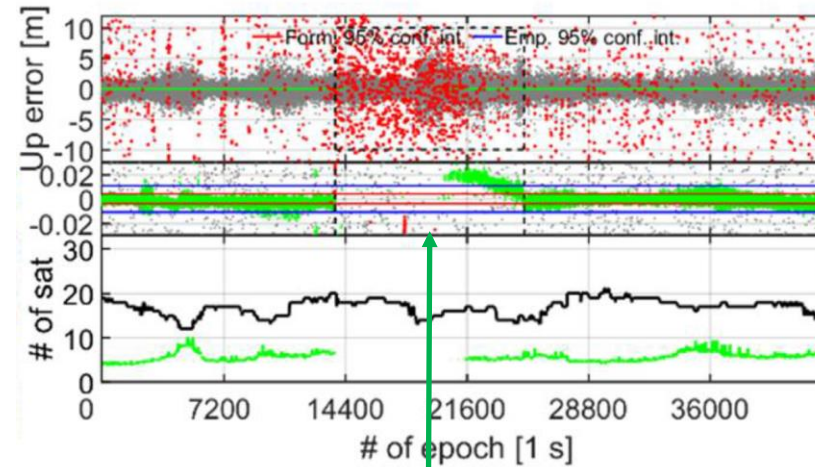
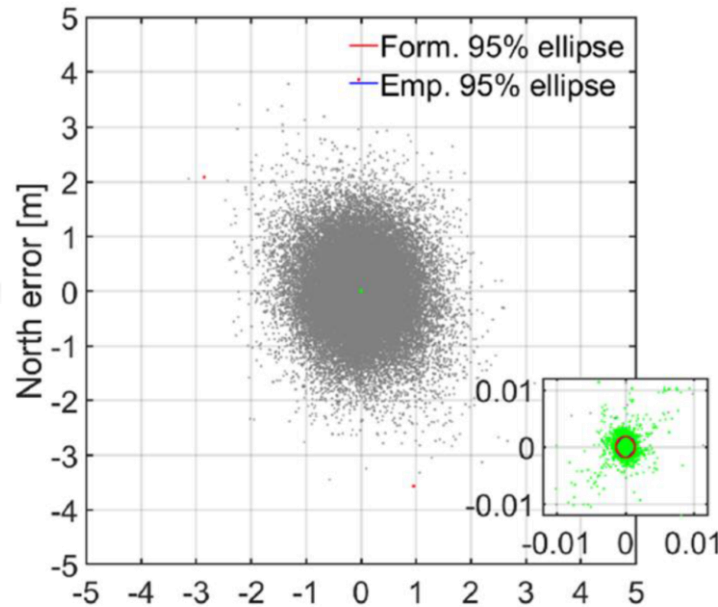
✓ GP4 ILS SR: 99.9%

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GP4



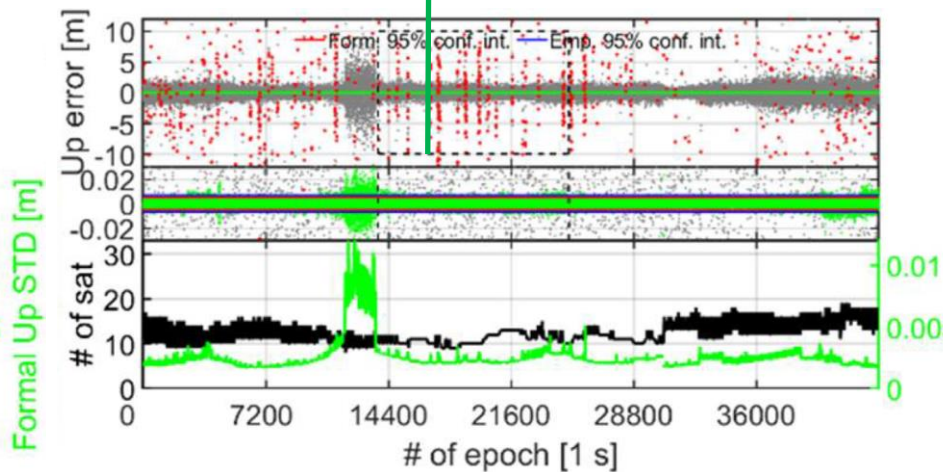
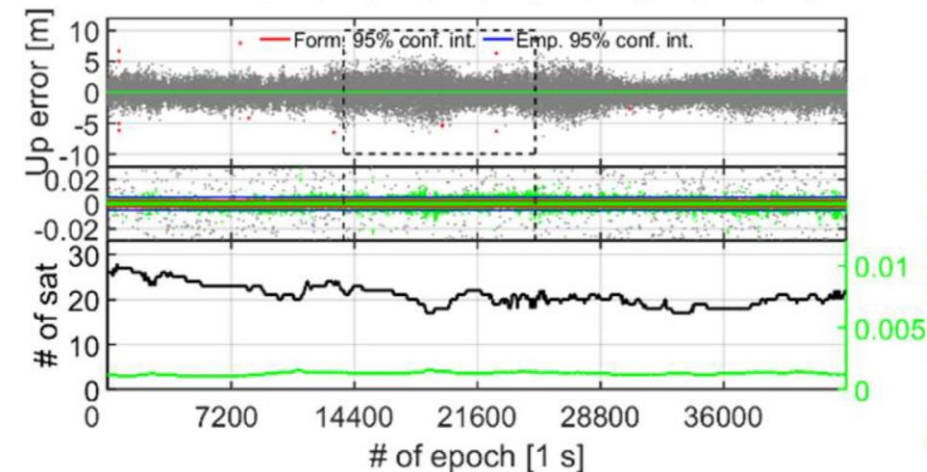
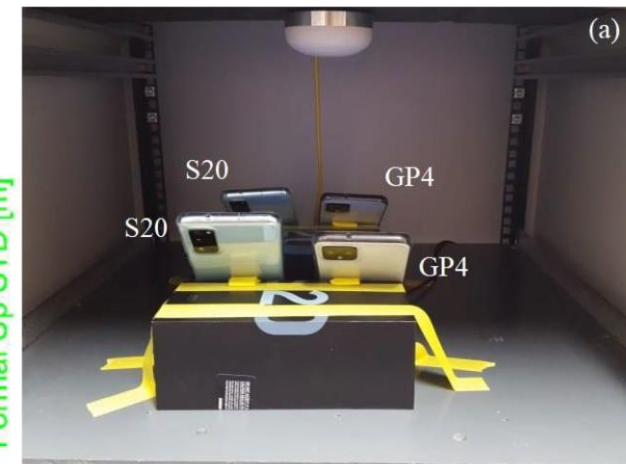
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Formal Up STD [m]

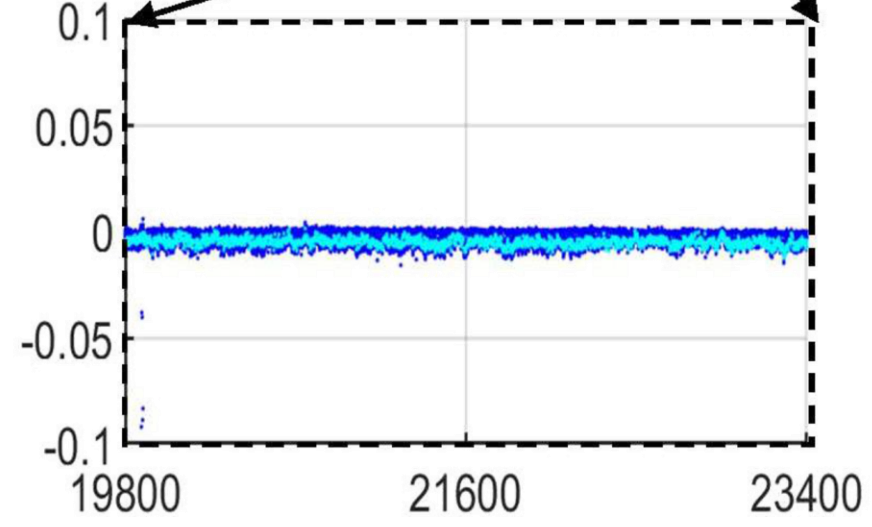
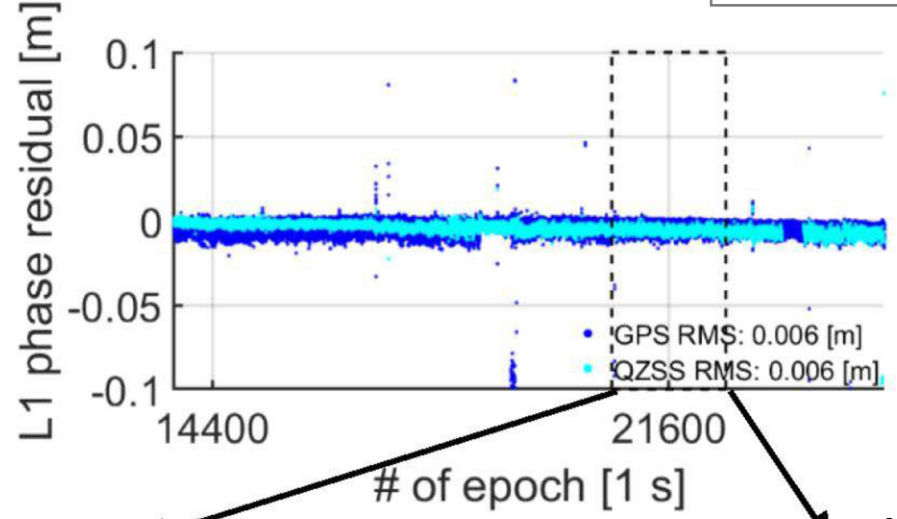
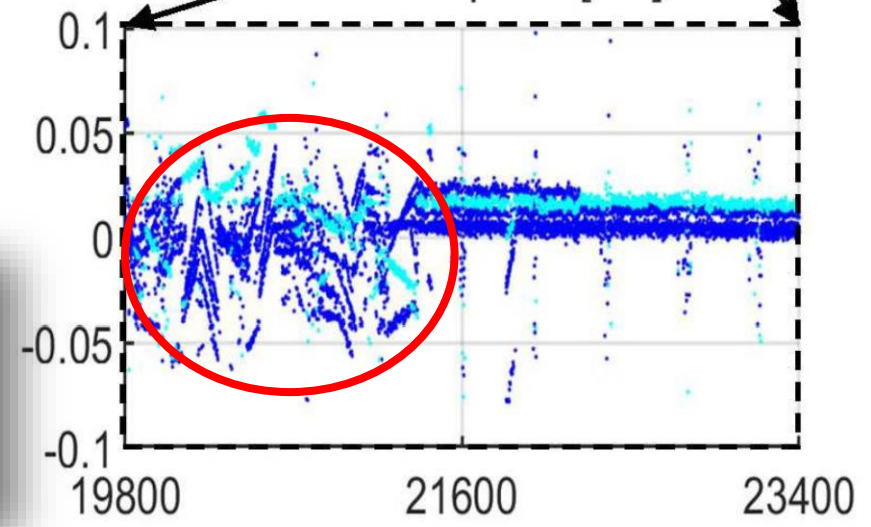
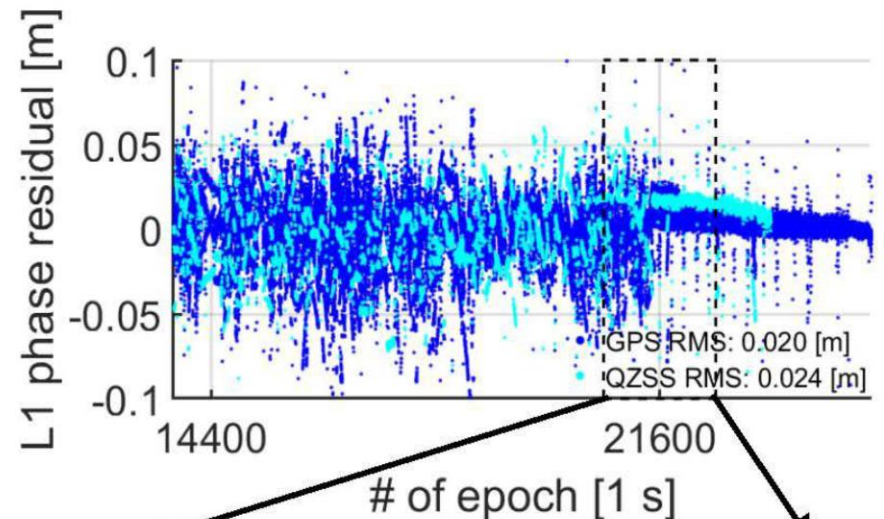
Formal Up STD [m]



Phase Residual (Samsung S20)

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.
Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.

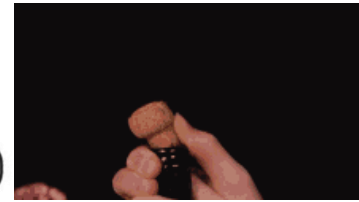
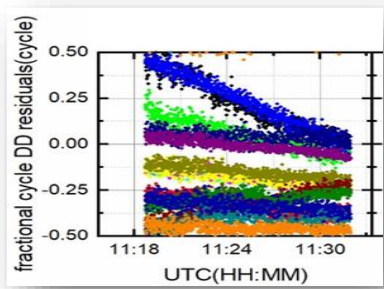
Lying down



Upright



No linear trend and non-zero-mean DD phase residuals



Setup Configurations (3), SBL internal antennas

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

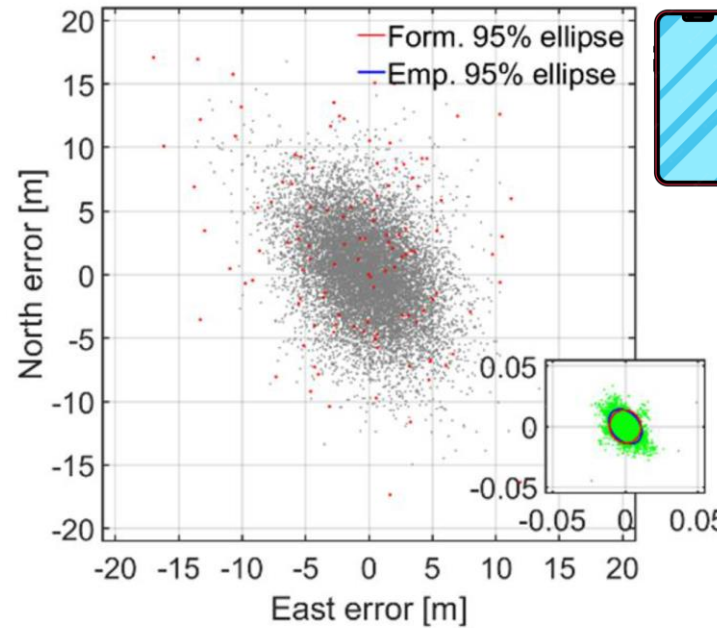
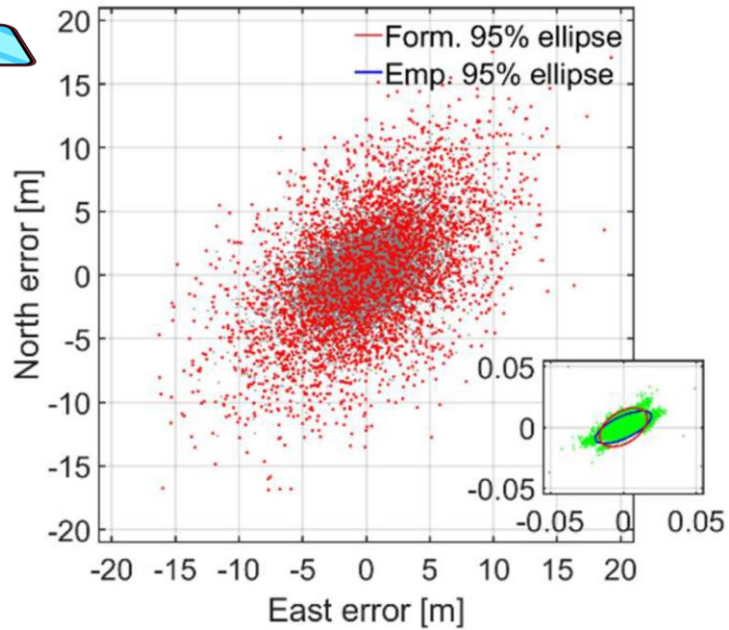
Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.



Short-baseline setup configurations with smartphones [internal](#) antennas in upright (a,b) and lying down (c,d) positions.



Short baseline using internal antennas



GP4 (internal; lying down)

ILS SR: **63.1%**

(36.9% incorrectly fixed)

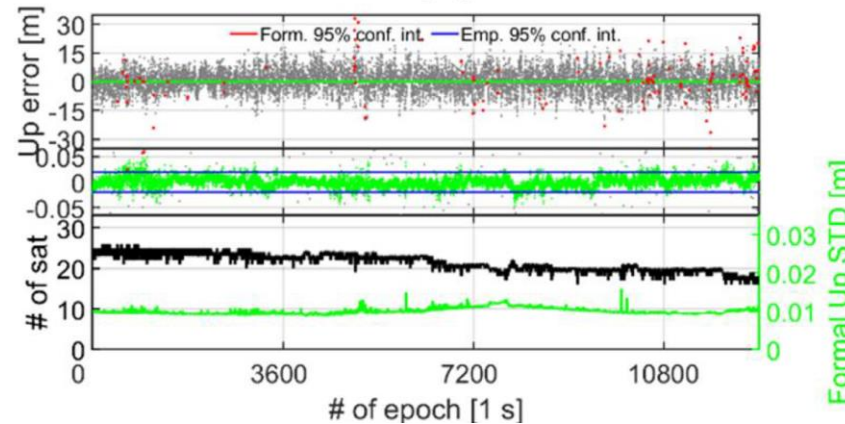
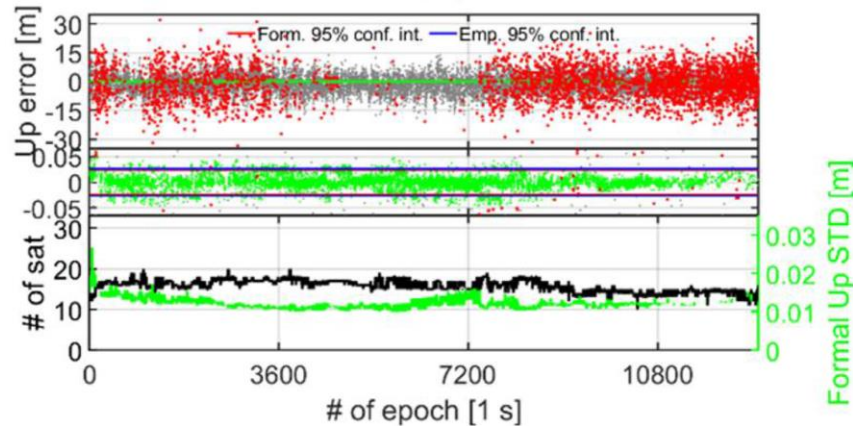
Mean \pm STDs m E -0.002 ± 0.008 m
 (correctly fixed): N -0.000 ± 0.005 m
 U -0.002 ± 0.013 m

GP4 (internal; upright)

ILS SR: **98.7%**

(1.3% incorrectly fixed)

Mean \pm STDs m E 0.001 ± 0.005 m
 (correctly fixed): N -0.001 ± 0.006 m
 U 0.001 ± 0.010 m



GP4 (external; upright)

ILS SR: **99.9%**

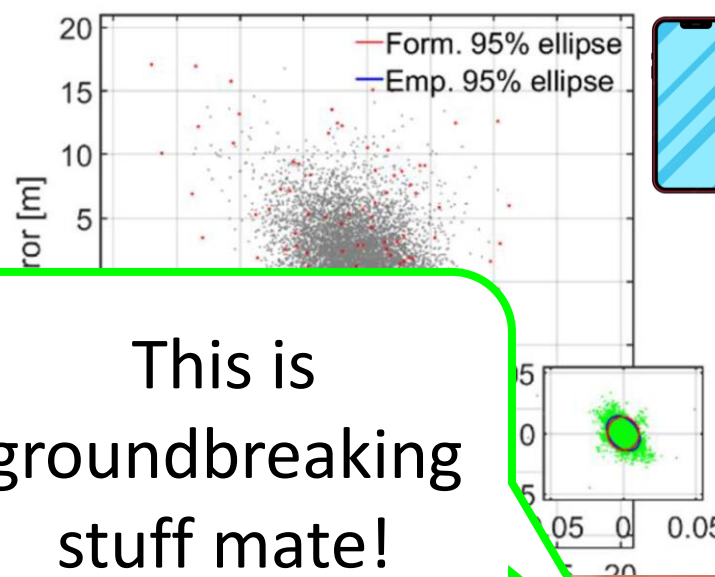
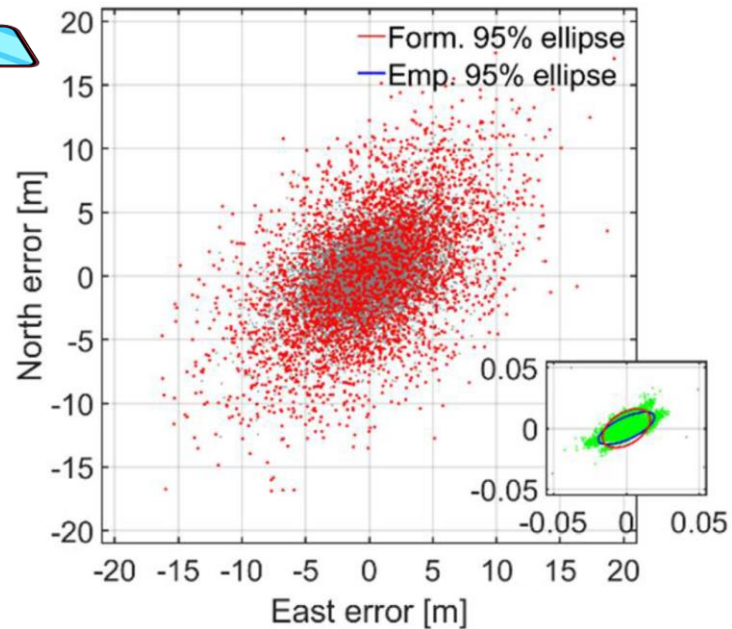
(0.1% incorrectly fixed)

Mean \pm STDs m E -0.001 ± 0.002 m
 (correctly fixed): N -0.000 ± 0.002 m
 U 0.000 ± 0.005 m



GP4

Short baseline using internal antennas



This is groundbreaking stuff mate!

GP4 (internal; lying down)

ILS SR: **63.1%**

(36.9% incorrectly fixed)

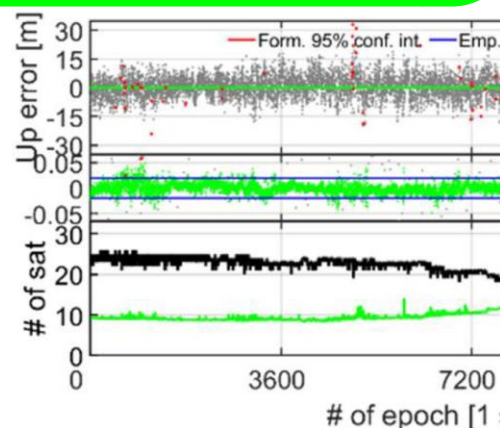
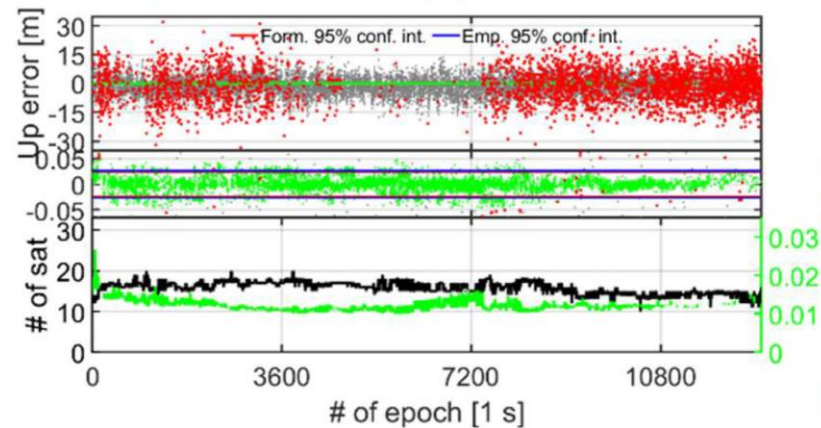
Mean \pm STDs m E -0.002 ± 0.008 m
 (correctly fixed): N -0.000 ± 0.005 m
 U -0.002 ± 0.013 m

GP4 (internal; upright)

ILS SR: **98.7%**

(1.3% incorrectly fixed)

Mean \pm STDs m E 0.001 ± 0.005 m
 (correctly fixed): N -0.001 ± 0.006 m
 U 0.001 ± 0.010 m



GP4 (external; upright)

ILS SR: **99.9%**

(0.1% incorrectly fixed)

Mean \pm STDs m E -0.001 ± 0.002 m
 (correctly fixed): N -0.000 ± 0.002 m
 U 0.000 ± 0.005 m

GP4

Best Integer Equivariant (BIE) vs ILS

1) Firstly assume $a \in \mathbb{R}^n$ and perform a least-squares adjustment, to obtain the 'float solution', denoted with a 'hat', and its (co)variance matrices,

$$\begin{bmatrix} \hat{a} \\ \hat{b} \end{bmatrix}, \begin{bmatrix} Q_{\hat{a}\hat{a}} & Q_{\hat{a}\hat{b}} \\ Q_{\hat{b}\hat{a}} & Q_{\hat{b}\hat{b}} \end{bmatrix} \quad (2)$$

Float

2) Secondly decorrelate ambiguities through the LAMBDA method $\hat{z} = Z^T \hat{a}$ to obtain an almost diagonal variance matrix $Q_{\hat{z}\hat{z}} = Z^T Q_{\hat{a}\hat{a}} Z$. We then find the **single** integer candidate vector through an integer search that minimizes the weighted squared norm,

$$\arg \min_{z \in \mathbb{Z}^n} \|\hat{z} - z\|_{Q_{\hat{z}\hat{z}}}^2 \quad (3)$$

3) where $\|\cdot\|_{Q_{\hat{z}\hat{z}}}^2 = (\cdot)^T Q_{\hat{z}\hat{z}}^{-1} (\cdot)$. Finally we transform $\check{a} = Z^{-T} \check{z}$ and compute the fixed **ILS** baseline solution \check{b} , denoted with 'check', and its variance matrix,

$$\check{b} = \hat{b} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} (\hat{a} - \check{a}), \quad Q_{\check{b}\check{b}} = Q_{\hat{b}\hat{b}} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} Q_{\hat{a}\hat{b}} \quad (4)$$

Fixed ILS

Best Integer Equivariant (BIE) vs ILS

1) Firstly assume $a \in \mathbb{R}^n$ and perform a least-squares adjustment, to obtain the 'float solution', denoted with a 'hat', and its (co)variance matrices,

$$\begin{bmatrix} \hat{a} \\ \hat{b} \end{bmatrix}, \begin{bmatrix} Q_{\hat{a}\hat{a}} & Q_{\hat{a}\hat{b}} \\ Q_{\hat{b}\hat{a}} & Q_{\hat{b}\hat{b}} \end{bmatrix} \quad (2)$$

Float

2) Secondly decorrelate ambiguities through the LAMBDA method $\hat{z} = Z^T \hat{a}$ to obtain an almost diagonal variance matrix $Q_{\hat{z}\hat{z}} = Z^T Q_{\hat{a}\hat{a}} Z$.

The **BIE estimator** on the other hand is defined by an infinite weighted sum over the whole space of integers as follows,

$$\bar{a} = \sum_{z \in \mathbb{Z}^n} z \frac{\exp\left(-\frac{1}{2} \|\hat{a} - z\|_{Q_{\hat{a}\hat{a}}}^2\right)}{\sum_{z \in \mathbb{Z}^n} \exp\left(-\frac{1}{2} \|\hat{a} - z\|_{Q_{\hat{a}\hat{a}}}^2\right)} \quad (5)$$

3) The fixed BIE baseline solution \bar{b} can then be derived, denoted with 'overline',

$$\bar{b} = \hat{b} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} (\hat{a} - \bar{a}) \quad (7)$$

Fixed BIE

Best Integer Equivariant (BIE) vs ILS

$$\begin{bmatrix} \hat{a} \\ \hat{b} \end{bmatrix}, \begin{bmatrix} Q_{\hat{a}\hat{a}} & Q_{\hat{a}\hat{b}} \\ Q_{\hat{b}\hat{a}} & Q_{\hat{b}\hat{b}} \end{bmatrix} \quad (2)$$

$$\arg \min_{z \in \mathbb{Z}^n} \|\hat{z} - z\|_{Q_{\hat{z}\hat{z}}}^2 \quad (3)$$

$$\check{b} = \hat{b} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} (\hat{a} - \check{a}), \quad Q_{\check{b}\check{b}} = Q_{\hat{b}\hat{b}} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} Q_{\hat{a}\hat{b}} \quad (4)$$

$$\bar{a} = \sum_{z \in \mathbb{Z}^n} z \frac{\exp\left(-\frac{1}{2} \|\hat{a} - z\|_{Q_{\hat{a}\hat{a}}}^2\right)}{\sum_{z \in \mathbb{Z}^n} \exp\left(-\frac{1}{2} \|\hat{a} - z\|_{Q_{\hat{a}\hat{a}}}^2\right)} \quad (5)$$

$$\|\hat{a} - z\|_{Q_{\hat{a}\hat{a}}}^2 < \lambda^2 \quad (6)$$

$$\bar{b} = \hat{b} - Q_{\hat{b}\hat{a}} Q_{\hat{a}\hat{a}}^{-1} (\hat{a} - \bar{a}) \quad (7)$$

Float

Fixed ILS

Fixed BIE

Properties of the BIE

It has been shown in Teunissen (2003) that the BIE is unbiased and has minimum variance (dispersion $D(\cdot)$), i.e.

$$E(\bar{b}) = E(\check{b}) = E(\hat{b}) = b$$

$$D(\bar{b}) \leq D(\check{b}) \quad (8)$$

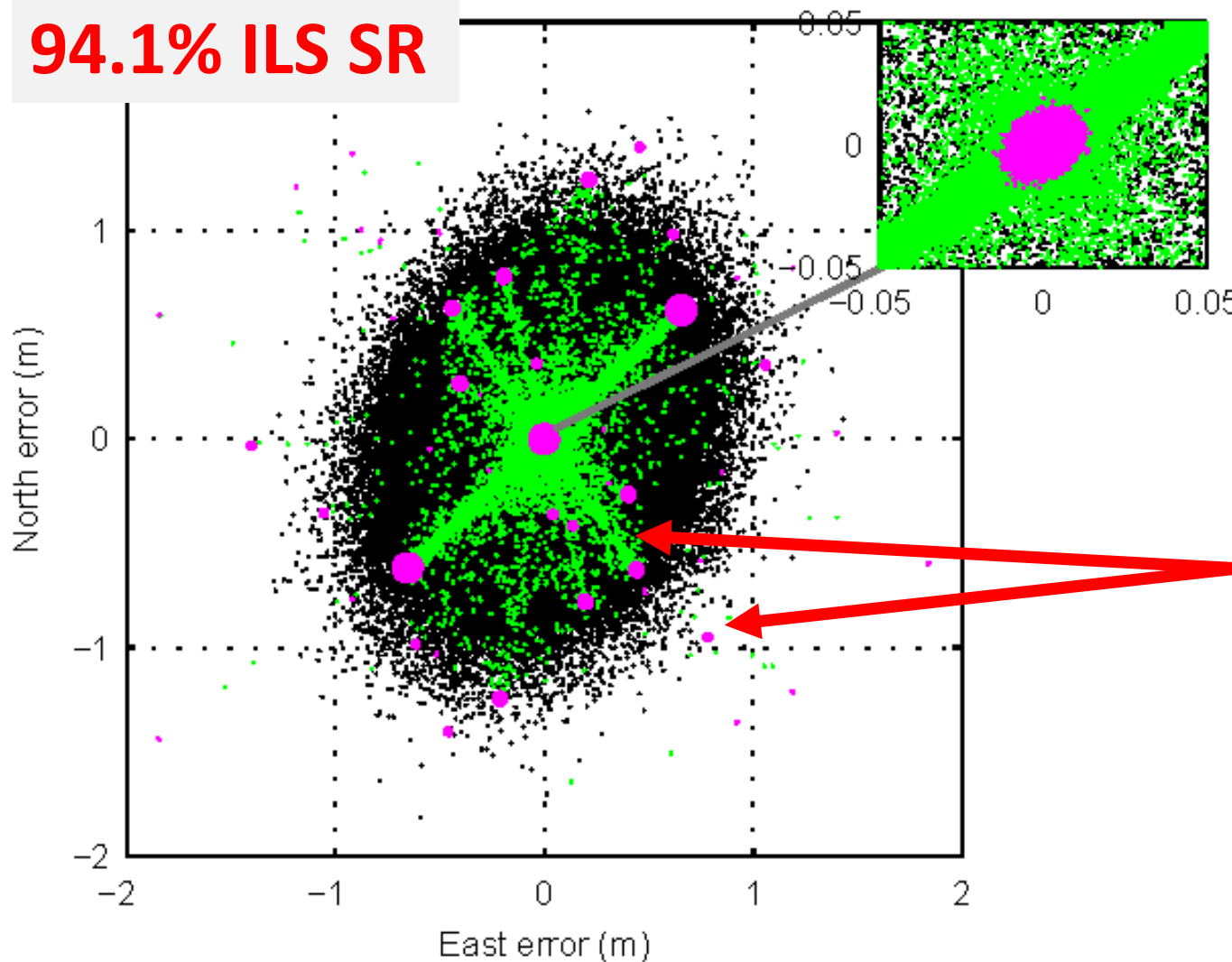
$$D(\bar{b}) \leq D(\hat{b})$$

In other words precision of **BIE** \leq **ILS** and **BIE** \leq **Float**

BIE gives more reliable positions when the ILS success rate, i.e. the probability of correct integer ambiguity resolution, is different from one. It also avoids the need for the use of integer ambiguity validation techniques (like the fixed failure ratio test).

Simulated single-epoch SF L1 GPS RTK positioning

94.1% ILS SR



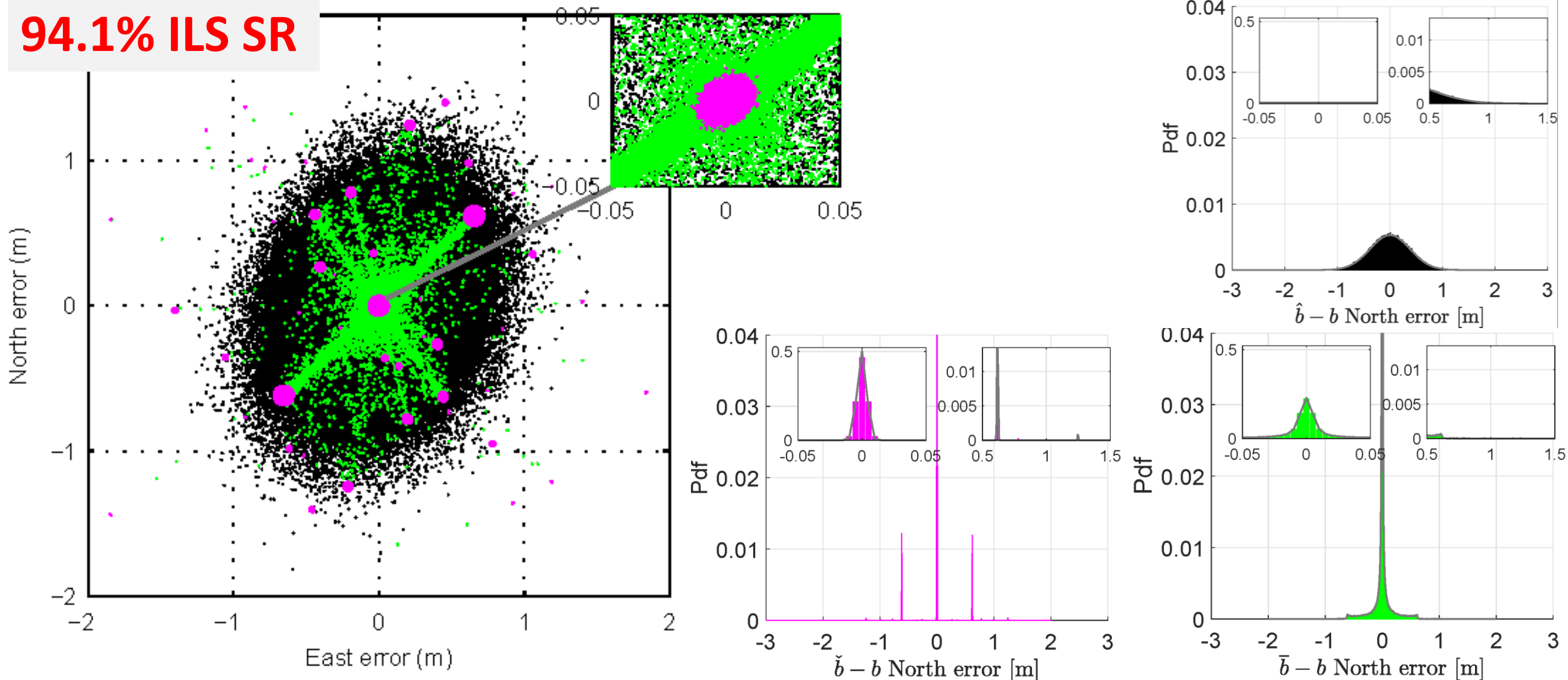
BIE follows a 'star-like' distributional pattern, and for instances when the distance between these **ILS** solutions and the **float** solutions are large, these incorrect **ILS** solutions are shown to not be as heavily weighted into the **BIE** solutions

Float = black, ILS = magenta, BIE = green

Reference: Odolinski, R., & Teunissen, P. J. G. (2020). Best integer equivariant estimation: Performance analysis using real data collected by low-cost, single- and dual-frequency, multi-GNSS receivers for short- to long-baseline RTK positioning. *Journal of Geodesy*, 94, 91.

Simulated single-epoch SF L1 GPS RTK positioning

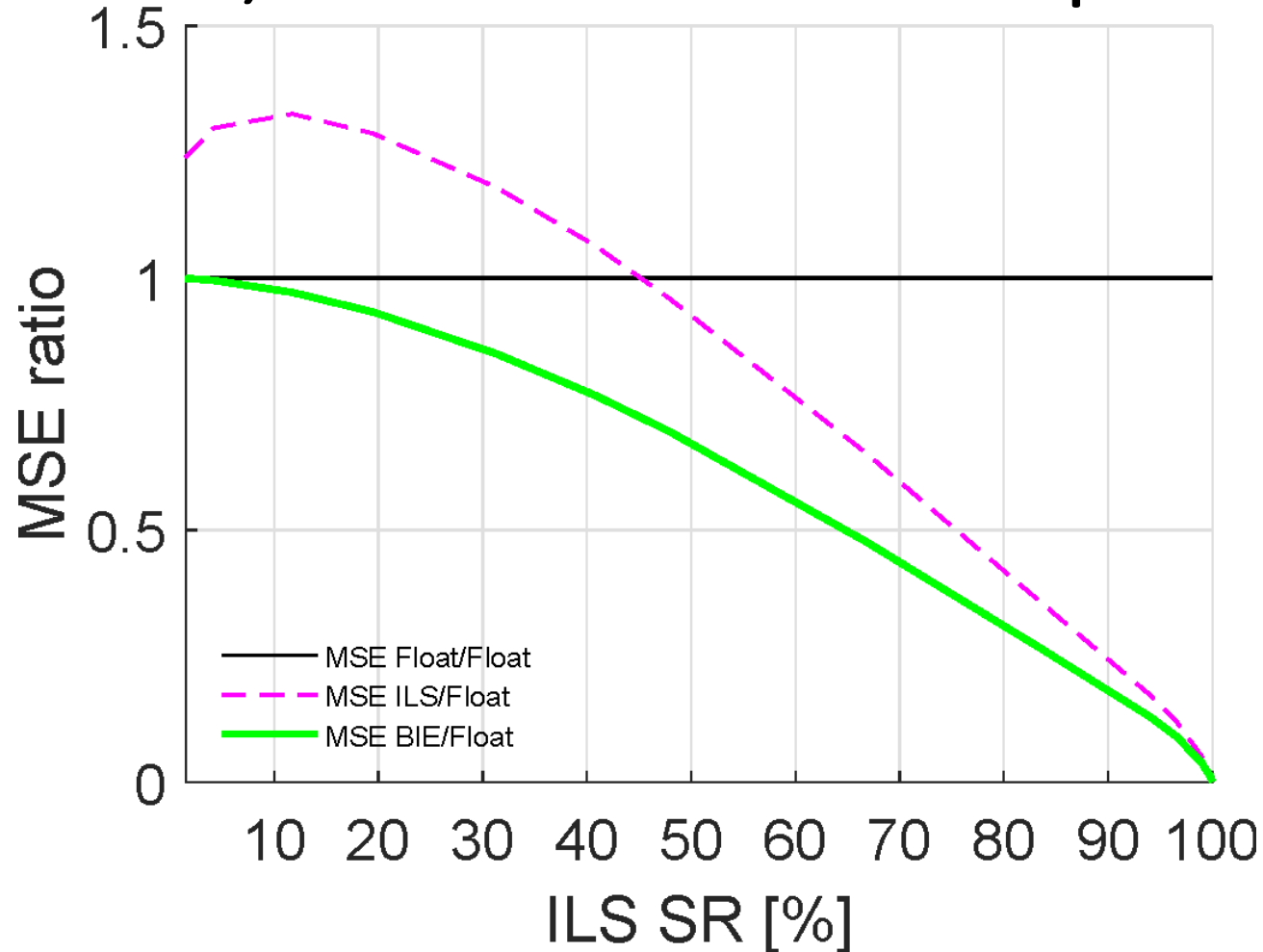
94.1% ILS SR



Float = black, ILS = magenta, BIE = green

Reference: Odolinski, R., & Teunissen, P. J. G. (2020). Best integer equivariant estimation: Performance analysis using real data collected by low-cost, single- and dual-frequency, multi-GNSS receivers for short- to long-baseline RTK positioning. *Journal of Geodesy*, 94, 91.

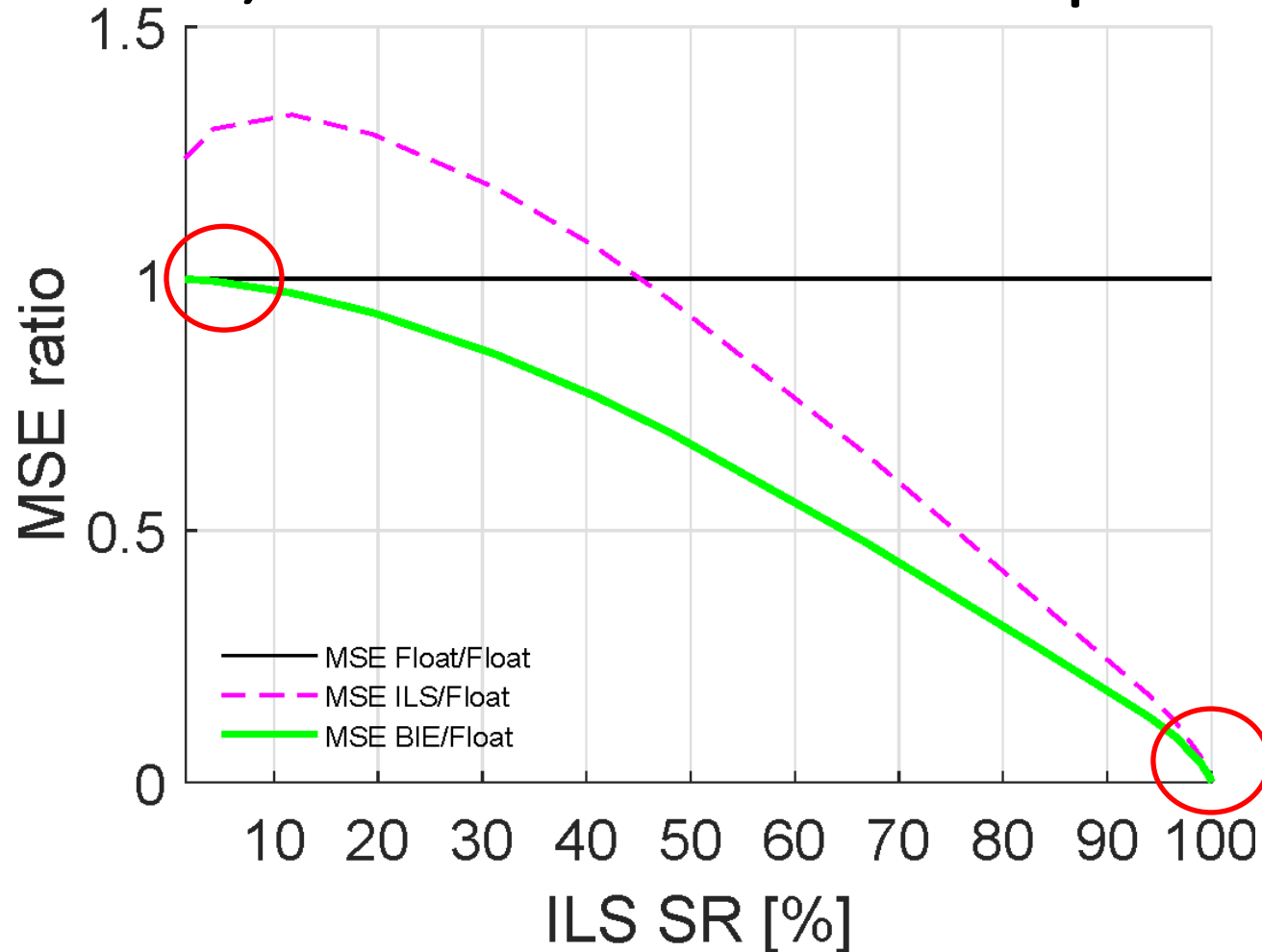
BIE, ILS and Float Mean Square Errors



Mean Square Error (MSE) ratios (vs float) of

Float = black, ILS = magenta, BIE = green

BIE, ILS and Float Mean Square Errors



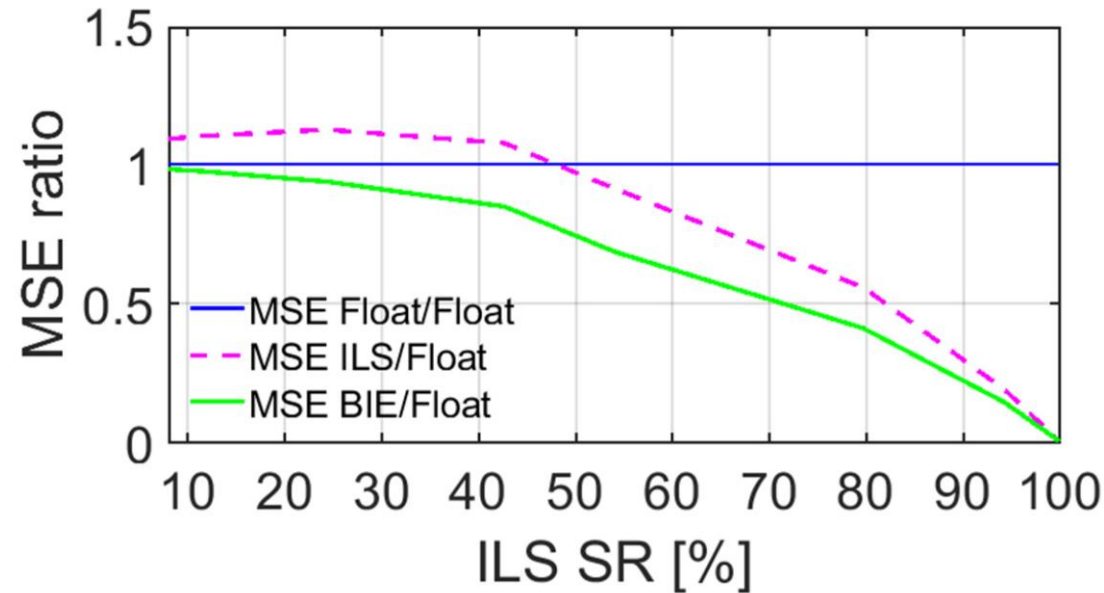
The MSEs of **BIE** are always smaller than both **float** and **ILS**, where in the limiting cases, with ILS SRs approaching 0% and 100%, we can see that **BIE** becomes equal to the **float** and **ILS** solutions, respectively

$$\begin{aligned} D(\bar{b}) &\leq D(\check{b}) \\ D(\bar{b}) &\leq D(\hat{b}) \end{aligned} \quad (8)$$

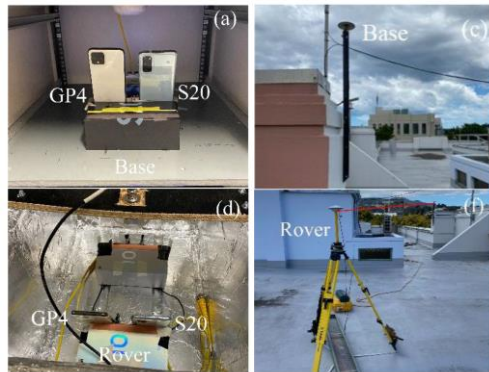
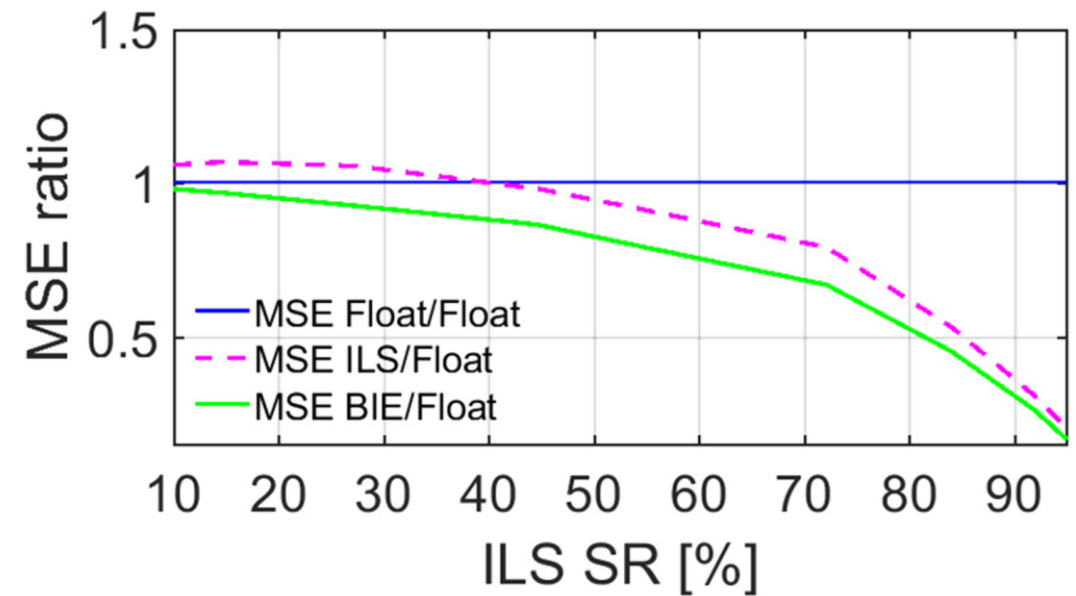
Mean Square Error (MSE) ratios (vs float) of
Float = black, ILS = magenta, BIE = green

Mean Squared Errors (MSE) ratios for Google Pixel 4

External antennas SF RTK



Internal antennas DF RTK



Conclusions

- When having the smartphones lying down, the RTK positioning performance, for S20 in particular, will deteriorate.
- We demonstrated, for the first time, a near hundred percent (98.7%) instantaneous RTK integer least-squares success rate for GP4 smartphones and cm level positioning precision while using short-baseline experiments with internal antennas.
- The BIE performance resembles that of the float estimator when the ILS SR is very low and was similar to that of the ILS when the ILS SR is very high.
- We demonstrated that BIE outperformed both the float and the ILS estimators even when on the basis of real GP4 smartphone data while using external and internal smartphone antennas.

Part 2: Evaluation of the multi-GNSS, dual-frequency RTK positioning performance for some recent Android smartphone models in a phone-to-phone setup

Robert Odolinski^{1,2}, Hongzhou Yang^{1,3}, Li-Ta Hsu^{1,4}, Mohammed Khider¹, Guoyu (Michael) Fu¹, Damien Dusha¹

1 Google LLC, Mountain View, California, USA

2 National School of Surveying, University of Otago, Dunedin, New Zealand

3 Department of Geomatics Engineering, University of Calgary, Calgary, Canada

4 Department of Aeronautical and Aviation Engineering, Hong Kong Polytechnic University, Hong Kong

GNSS data collection

Part 1: RTK Google Pixel 4 and Samsung Galaxy S20, ILS and BIE.

Part 2: RTK Google Pixel5, Pixel6 Pro, Pixel7 Pro and Samsung Galaxy S22.

Fig. 1. GNSS data collection (21 Nov, 2023) in Mountain View, USA



Table 1 2 h, 53 min and 48 s (1Hz) of short-baseline GNSS data using internal smartphone antennas (Fig. 1) and 5 degree cut-off angle

<u>Android smartphone (GNSS chipset)</u>	<u>GNSS signals tracked</u>
Google Pixel5 (Qualcomm Snapdragon 765G, SM7250)	L1,L5, E1, E5a, B1I/B1c, L1, L5, L1 GPS, Galileo, BDS, QZSS, GLONASS
Google Pixel6 Pro (Broadcom BCM47765)	L1,L5, E1, E5a, B1I/B1c, B2a, L1, L5, L1 GPS, Galileo, BDS, QZSS, GLONASS
Google Pixel7 Pro (Broadcom BCM47765)	L1,L5, E1, E5a, B1I/B1c, B2a, L1, L5, L1 GPS, Galileo, BDS, QZSS, GLONASS
Samsung S22 (Samsung SLSI K401)	L1,L5, E1, E5a, B1I/B1c, B2a, L1, L5, L1 GPS, Galileo, BDS, QZSS, GLONASS

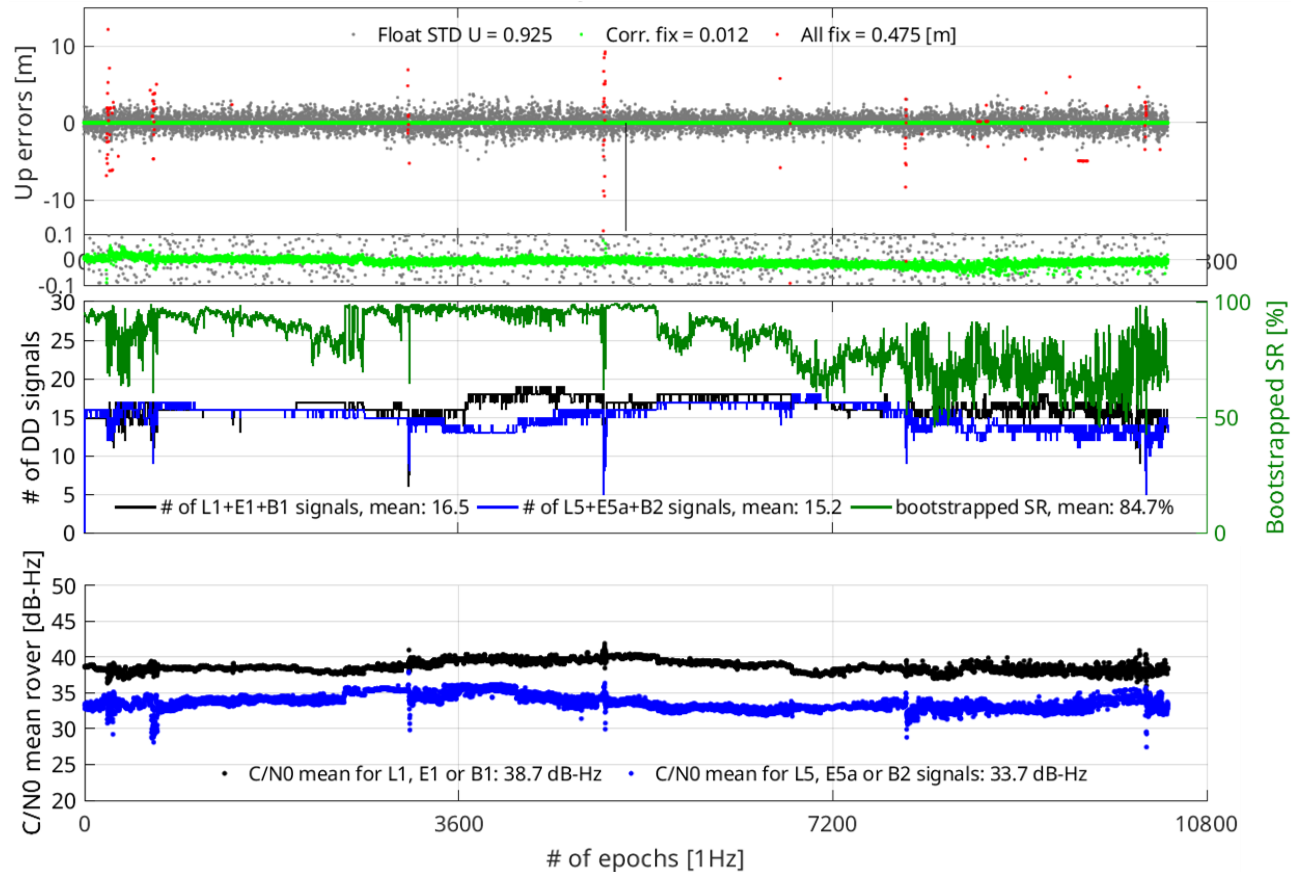
Single-epoch RTK positioning with Android smartphones

Google Pixel7-to-Pixel7 RTK positioning

(98.7% ILS SR):

L1+L5, E1+E5a, B1+B2a GPS+Galileo+BDS

Outlier detection and C/N0 20 dB-Hz mask on



Reference: Odolinski, R., Yang, H., Hsu, L.-T., Khider, M., Fu, G. (M.), Dusha, D. (2024) Evaluation of the Multi-GNSS, Dual-Frequency RTK Positioning Performance for Recent Android Smartphone Models in a Phone-to-Phone Setup. In *Proceedings of the 2024 International Technical Meeting of The Institute of Navigation*, Long Beach, California, January 2024, pp. 42-53. <https://doi.org/10.33012/2024.19575>

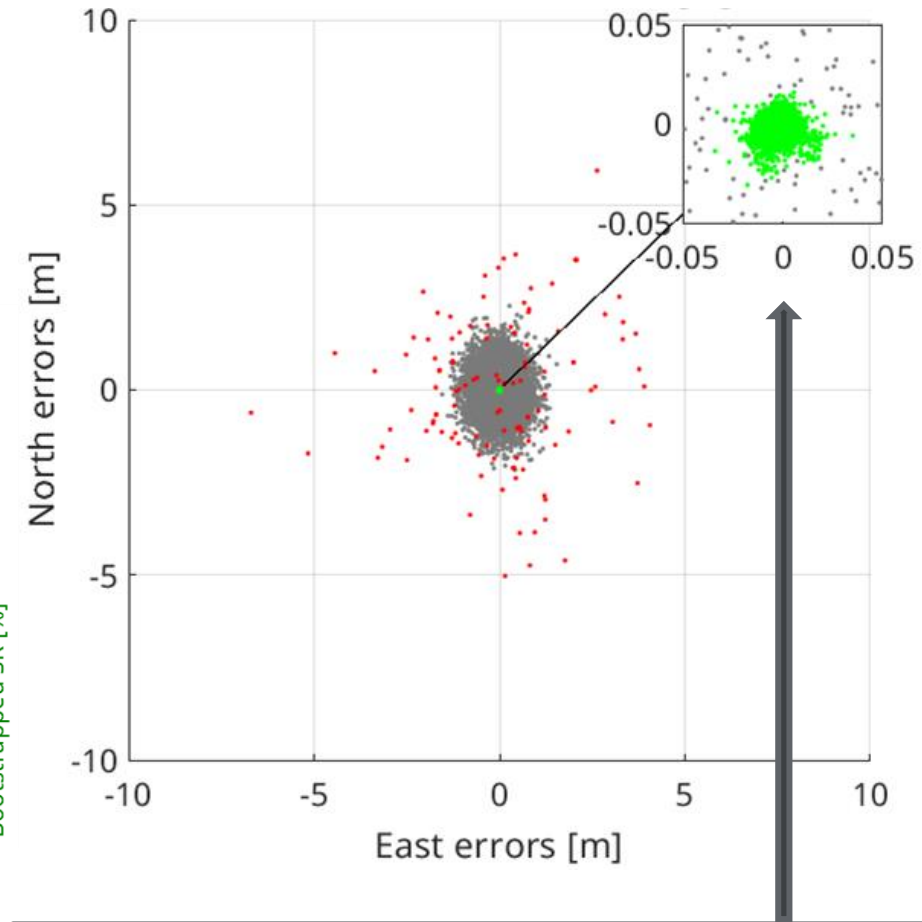
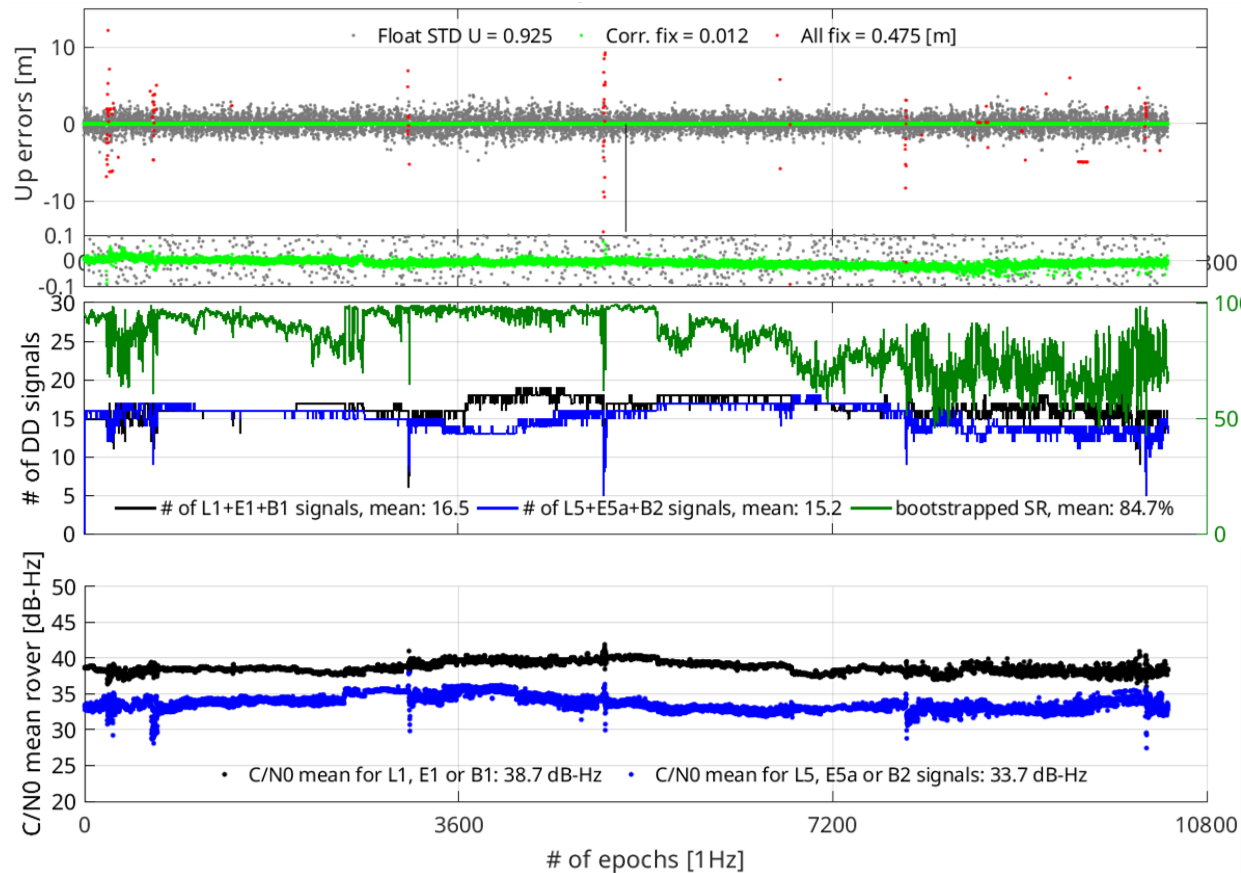
How about the single-epoch horizontal components?

Google Pixel7-to-Pixel7 RTK positioning

(98.7% ILS SR):

L1+L5, E1+E5a, B1+B2a GPS+Galileo+BDS

Outlier detection and C/N0 20 dB-Hz mask on



The horizontal North and East errors are shown with a zoom-in to also depict the **correctly fixed solutions at the mm-level**, and we can generally see a well distributed positioning error scatter plot.

Reference: Odolinski, R., Yang, H., Hsu, L.-T., Khider, M., Fu, G. (M.), Dusha, D. (2024) Evaluation of the Multi-GNSS, Dual-Frequency RTK Positioning Performance for Recent Android Smartphone Models in a Phone-to-Phone Setup. In *Proceedings of the 2024 International Technical Meeting of The Institute of Navigation*, Long Beach, California, January 2024, pp. 42-53. <https://doi.org/10.33012/2024.19575>

Single-epoch RTK positioning with Android smartphones

<u>Android smartphone baseline (GNSS chipset)</u>	<u>GNSS signals tracked</u>	<u>ILS SR [%]</u>	<u>Corr. fix STD N/E/U [m]</u>	<u>Float STD N/E/U [m]</u>
Samsung S22 to S22 (Samsung SL8I K401) *GNSS data logging at start	L1,L5, E1, E5a, B1I/B1c, B2a GPS, Galileo, BDS	97.8*	0.009 0.005 0.015	1.29 0.78 2.11
Google Pixel5 to Pixel5 (Qualcomm Snapdragon 765G, SM7250) **needs further investigation	L1,L5, E1, E5a, B1I/B1c GPS, Galileo, BDS	99.4	0.004 0.017* 0.007	0.59 0.41 1.07
Google Pixel6 to Pixel6 (Pro) (Broadcom BCM47765)	L1,L5, E1, E5a, B1I/B1c, B2a GPS, Galileo, BDS	98.3	0.004 0.006 0.017	0.70 0.53 1.24
Google Pixel7 to Pixel7 (Pro) (Broadcom BCM47765)	L1,L5, E1, E5a, B1I/B1c, B2a GPS, Galileo, BDS	98.7	0.004 0.004 0.012	0.54 0.36 0.93

Note the > two order of magnitude improvement when going from the ambiguity-float to correctly fixed solutions

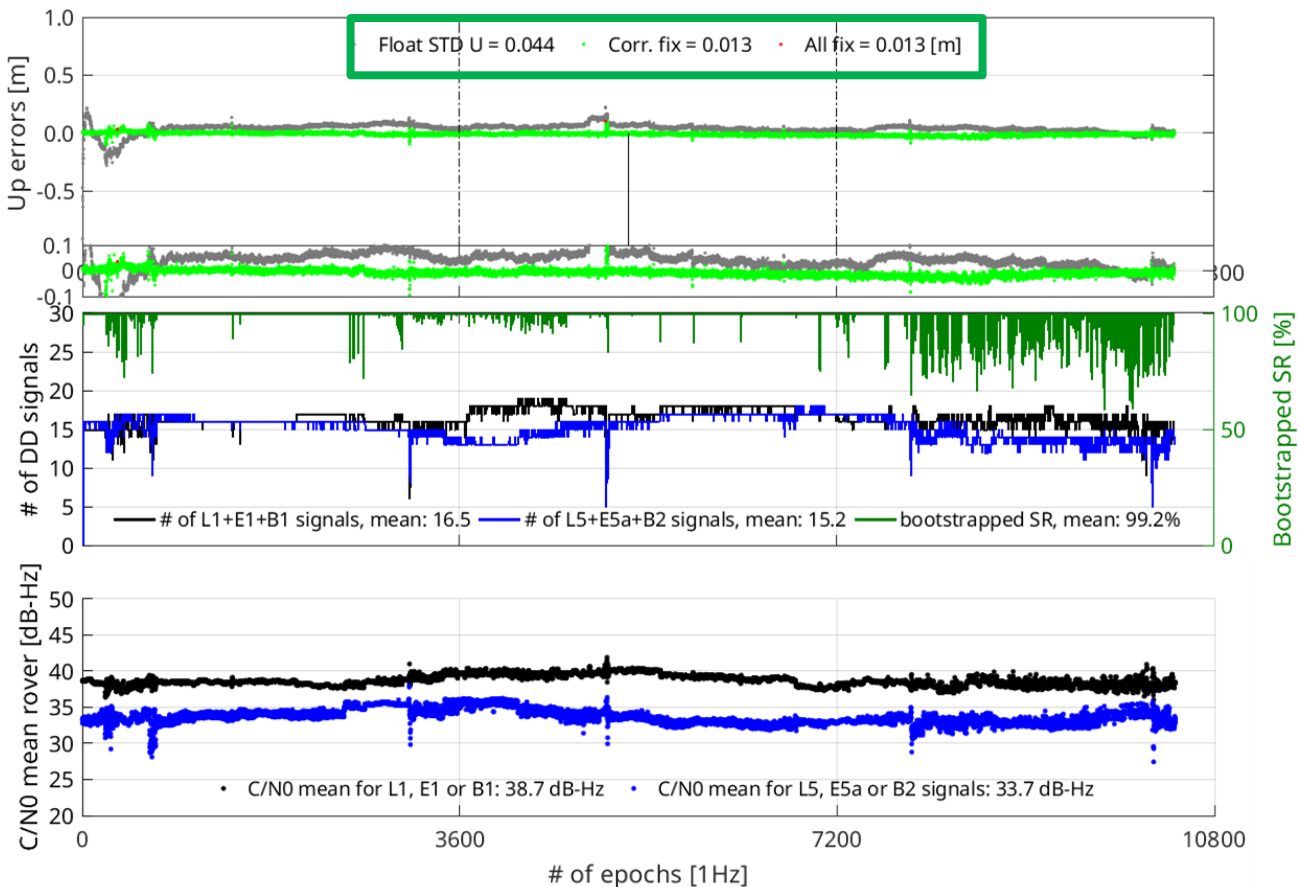
Multi-epoch RTK positioning with Android smartphones

Google Pixel7-to-Pixel7 RTK positioning

(100.0% ILS SR):

L1+L5, E1+E5a, B1I+B2a GPS+Galileo+BDS

Outlier detection and C/N0 20 dB-Hz mask on



The 'multi-epoch' model implies here that **the ambiguities are treated as time-constant parameters through a dynamic model** in a Kalman filter, and the precision of the ambiguity-float estimated positions is therefore expected to improve over time.

This is also shown by the **corresponding Up component STD being 4.4 cm** (compare to the **ambiguity-fixed Up STD of 1.3 cm**).

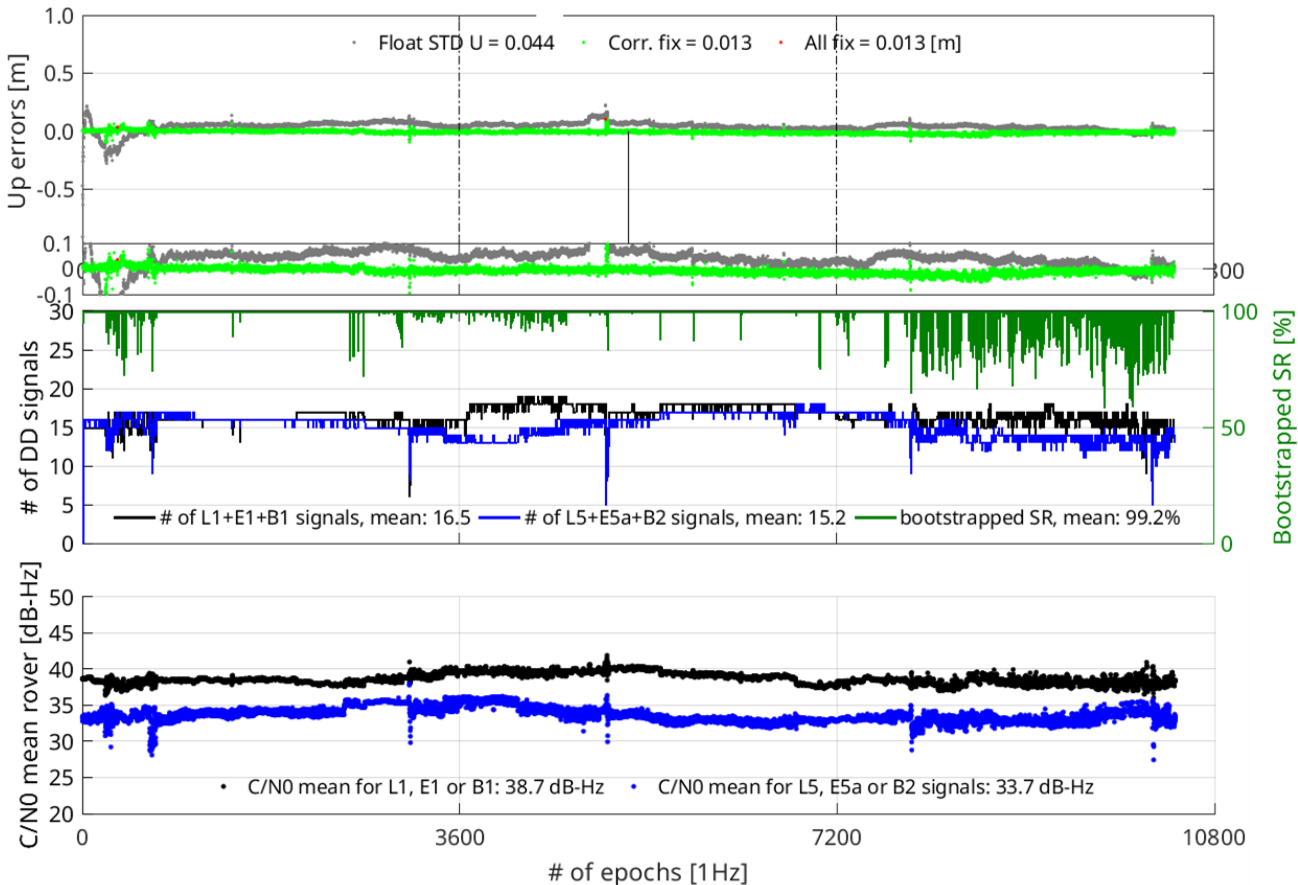
Multi-epoch RTK positioning with Android smartphones

Google Pixel7-to-Pixel7 RTK positioning

(100.0% ILS SR):

L1+L5, E1+E5a, B1I+B2a GPS+Galileo+BDS

Outlier detection and C/N0 20 dB-Hz mask on



The ‘multi-epoch’ model implies here that **the ambiguities are treated as time-constant parameters through a dynamic model** in a Kalman filter, and the precision of the ambiguity-fixed estimated positions is therefore expected to improve over time.

This is also shown by the **corresponding Up component STD** being 4.4 cm (compare to the **ambiguity-fixed Up STD** of 1.3 cm).

Next we will **initialize the Kalman filter 3 times (every hour)**, which means we can compute a statistically relevant time to first fix (TTFF) of each solution. In the following it is defined as when the North, East and Up components are all below the 0.1 meter threshold and remains so for at least 5 minutes.

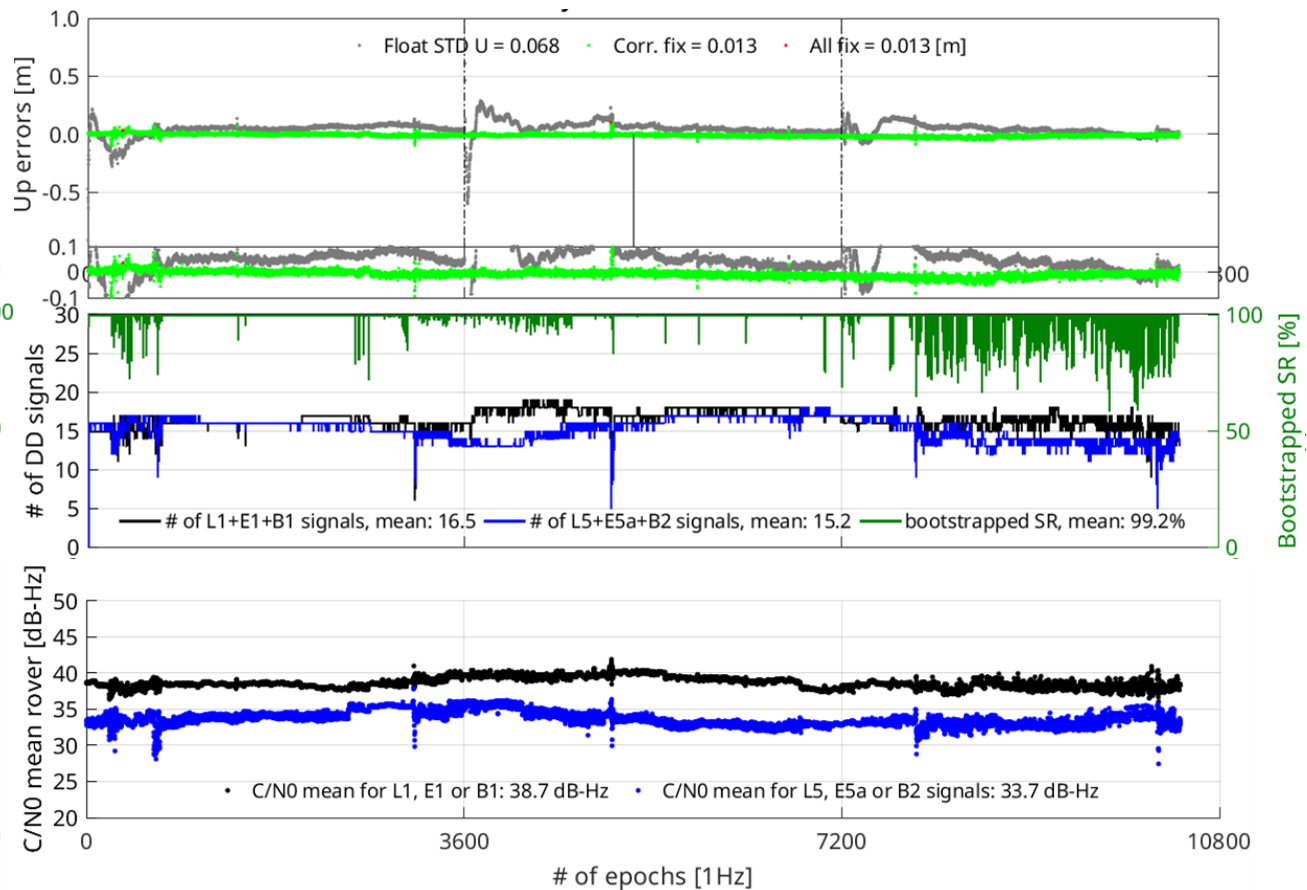
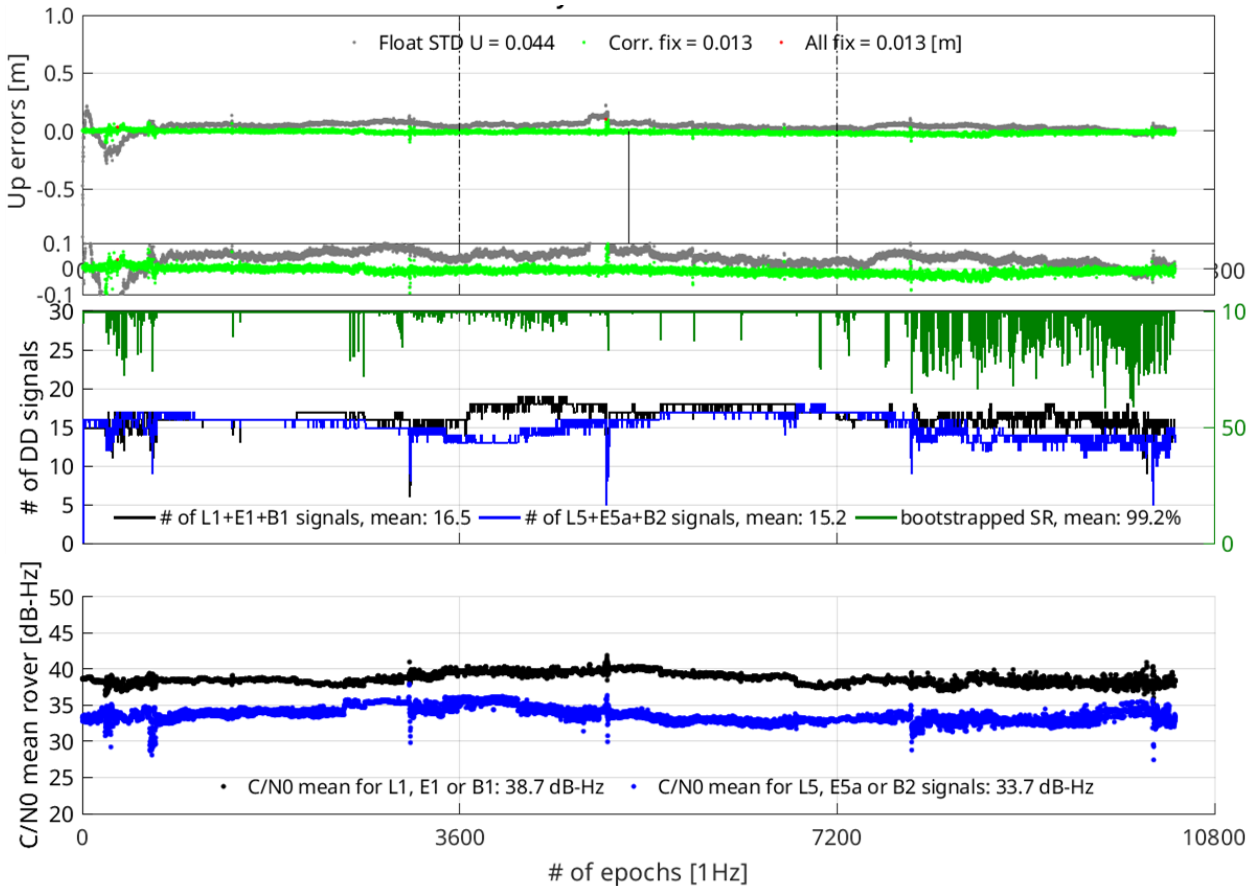
Multi-epoch RTK positioning with Android smartphones

Google Pixel7-to-Pixel7 RTK positioning

1 initialization (**100.0% ILS SR**):
L1+L5, E1+E5a, B1I+B2a GPS+Galileo+BDS
Outlier detection and C/N0 20 dB-Hz mask on

Google Pixel7-to-Pixel7 RTK positioning

3 re-initializations (**100.0% ILS SR**):
L1+L5, E1+E5a, B1I+B2a GPS+Galileo+BDS
Outlier detection and C/N0 20 dB-Hz mask on



Reference: Odolinski, R., Yang, H., Hsu, L.-T., Khider, M., Fu, G. (M.), Dusha, D. (2024) Evaluation of the Multi-GNSS, Dual-Frequency RTK Positioning Performance for Recent Android Smartphone Models in a Phone-to-Phone Setup. In *Proceedings of the 2024 International Technical Meeting of The Institute of Navigation*, Long Beach, California, January 2024, pp. 42-53. <https://doi.org/10.33012/2024.19575>

Multi-epoch RTK positioning with Android smartphones

Google Pixel7-to-Pixel7 RTK positioning

1 initialization (**100.0% ILS SR**):
L1+L5, E1+E5a, B1I+B2a GPS+Galileo+BDS
Outlier detection and C/N0 20 dB-Hz mask on

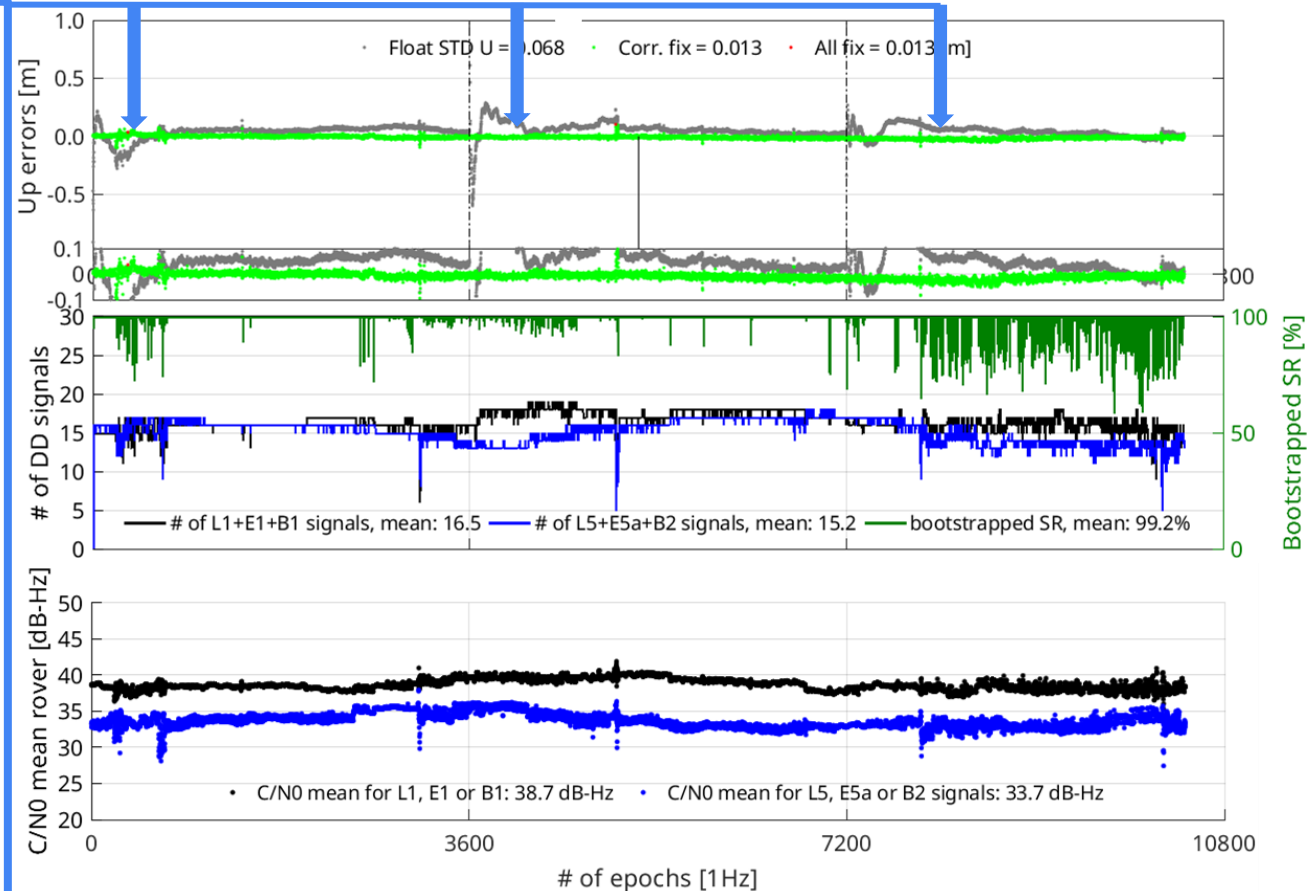
Google Pixel7-to-Pixel7 RTK positioning

3 re-initializations (**100.0% ILS SR**):
L1+L5, E1+E5a, B1I+B2a GPS+Galileo+BDS
Outlier detection and C/N0 20 dB-Hz mask on

The **TTFFs** to reach **< 0.1 m error** in North, East and Up for the float solutions are:

7 min 25 s,
8 min 26 s, and
12 min 16 s,

for the 1st, 2nd and 3rd initialization, respectively. This makes sense as the model strength is stronger for the first two initializations, respectively (see also the bootstrapped SR). The corresponding **fixed solutions all achieve such a threshold instantaneously**, i.e. within one epoch (although two of the solutions throughout the entire period become incorrectly fixed)

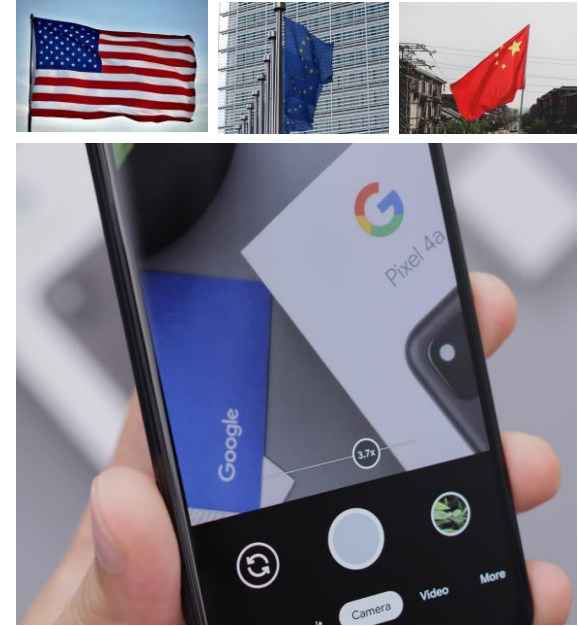


Evolution of the Multi-GNSS, Dual-Frequency RTK Positioning Performance for Recent

Conclusions

RTK tests were conducted with smartphones Google Pixel5, Pixel6 Pro, Pixel7 Pro, and Samsung Galaxy S22. Tracking dual frequency GPS, Galileo, QZSS, and BDS code and carrier phase observations.

- Achieved cm-level position and ~100% RTK integer least-squares success rates while stationary.



Source: all images from <https://unsplash.com>, used under <https://unsplash.com/license>

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