



Statistical Analysis of Android GNSS Raw Data Measurements in an Urban Environment for Smartphone Collaborative Positioning Methods

[1,2]

[2]

[2]

[3]

T. Verheyde , A. Blais , C. Macabiau , F.X. Marmet

[1] *Telecommunication Research Laboratory– TéSA, Toulouse, France.*

[2] *École Nationale Aviation Civile (ENAC) - Université de Toulouse, France*

[3] *Centre National d'Etudes Spatiales (CNES) – Toulouse, France*

[thomas.verheyde],[blais],[macabiau]@recherche.enac.fr
francois-xavier.marmet@cnes.fr



OUTLINE

I. Introduction

- a. Context
- b. Motivations
- c. Objectives

II. Methodology

- a. Experimentation Protocol
- b. Clock Drift Estimation
- c. DLL Jitter Estimation
- d. PLL & Doppler Jitter Estimation

III. Results Analysis

IV. Conclusions



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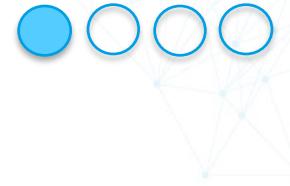
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I) Introduction - Context



- In May 2016**, Google announced that GNSS raw data measurements will be available on Android smartphones via their latest API Android 7.0. For the first time, developers and the scientific community will have access to GNSS measurements from the smartphone integrated receiver.



- A potential access to billions of GNSS smartphones data, leading to the use of advanced crowdsourcing GNSS processing techniques motivated my PhD thesis:

**Precise Cooperative Positioning of Low-Cost Mobiles
in an Urban Environment**

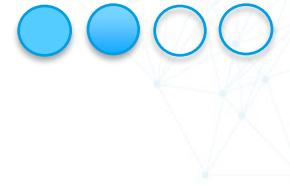
*Derived GNSS Measurements
obtained via Android*

Multiconstellation & Multifrequency

- Code measurements
- Phase measurements
- Doppler measurements
- SNR measurements
- Automatic Gain Control
- and more ...



I) Introduction - Motivations

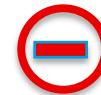


Android GNSS Raw Data Measurements Overview



Advantages

- Easy to record (GNSSLogger.apk or Geo++RinexLogger.apk)
- Support technological innovation
- Low-cost receiver
- Detailed documentation
- Analysis of the smartphone embedded GNSS algorithm

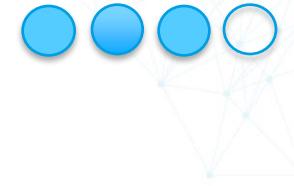


Drawbacks

- Poor quality antenna
- Duty cycle
- Variety of smartphones models and brands
- **Information on receiver architecture & tracking loop parameters are unknown**



I) Introduction - Motivations



- I. Exploring the feasibility of smartphone collaborative positioning [4]
- II. How does a smartphone perform compared to a low-cost GNSS receiver in an urban environment. [2][3]

III. Smartphone GNSS chipset receiver architecture & tracking loop parameters are unknown [1]

[1] Lehtola, V. V., Söderholm, S., Koivisto, M., & Montloin, L. (2019). Exploring GNSS crowdsourcing feasibility: Combinations of measurements for modeling smartphone and higher end GNSS receiver performance. *Sensors (Switzerland)*, 19(13), 1-17. [3018]. <https://doi.org/10.3390/s19133018>

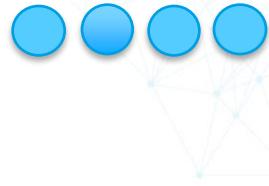
[2] Gioia, Ciro & Damy, Sophie & Borio, Daniele. (2019). Precise Time in your Pocket: Timing Performance of Android Phones. 137-148. 10.33012/2019.16749.

[3] Lachapelle, Gérard & Gratton, Paul & Horrelt, Jamie & Lemieux, Erica & Broumandan, Ali. (2018). Evaluation of a Low Cost Hand Held Unit with GNSS Raw Data Capability and Comparison with an Android Smartphone. *Sensors*. 18. 4185. 10.3390/s18124185.

[4] Garello, Roberto & Samson, Jaron & Spirito, Maurizio & Wymeersch, Henk. (2012). Peer-to-Peer Cooperative Positioning: Part II: Hybrid Devices with GNSS & Terrestrial Ranging Capability. Inside GNSS.



I) Introduction - Objectives



In order to explore the feasibility of smartphone collaborative positioning, accurate and realistic simulations must be developed. Classic error models may not apply, embedded smartphone receivers need to be treated as a black box receiver.

Existing error models will be derived from real measurements processing.

- Characterizing smartphones GNSS receiver's main parameters:
 - Phase jitter (σ_{PLL})
 - Code jitter (σ_{DLL})
 - Doppler jitter ($\sigma_{Doppler}$)
 - Clock drift ($c\dot{\delta}t$)
- Find a possible correlation between those parameters and phone brands/models or GNSS embedded chipset brands/models.



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II) Methodology - Protocols



9 tested smartphones

x2



x3



Qualcomm
Snapdragon 845



HiSilicon
Kirin 980



Qualcomm
Snapdragon 855



Broadcom
BCM47755



HiSilicon
Kirin 980



Qualcomm
Snapdragon 855

Multi-Constellation
Single Frequency

Multi-Constellation
Multi-Frequency

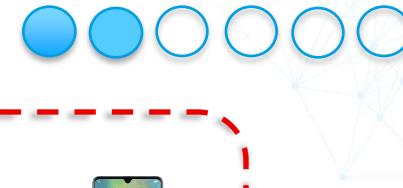
Multi-Constellation
Multi-Frequency

Multi-Constellation
Multi-Frequency

Multi-Constellation
Multi-Frequency

Multi-Constellation
Multi-Frequency

II) Methodology - Protocols



On the roof



On the roof



cnes
CENTRE NATIONAL D'ÉTUDES SPATIALES

Inside the vehicle



Xiaomi Mi 8 OPEN

Inside the vehicle



ASTX_U
GNSS Receiver

II) Methodology - Protocols



Data Collection Campaign Trajectory in Toulouse, FRANCE



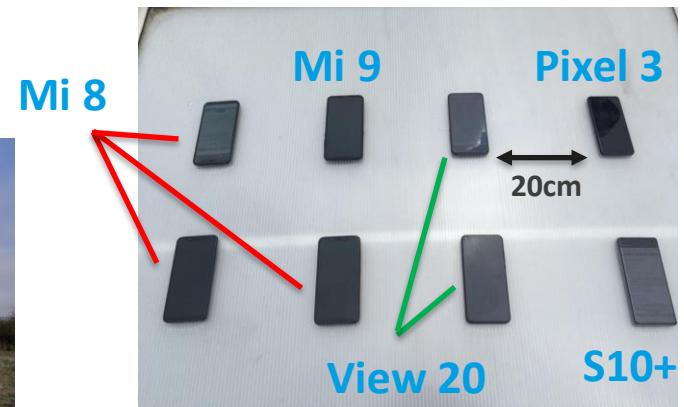
Static Scenario (Open Sky Environment)



Data Collection Campaign

- Various collaborative scenarios between two vehicles
- **Static scenarios for assessing nominal performance**
- Total of collection time \approx 10 hours

Rooftop Smartphones Configuration



II) Methodology - Clock Drift Estimation



Predicted Radial Satellite Movement: $v_i^{sv} * \overline{a_i^{sv}}$

with $\overline{a_i}$ being the user-satellite line of sight vector

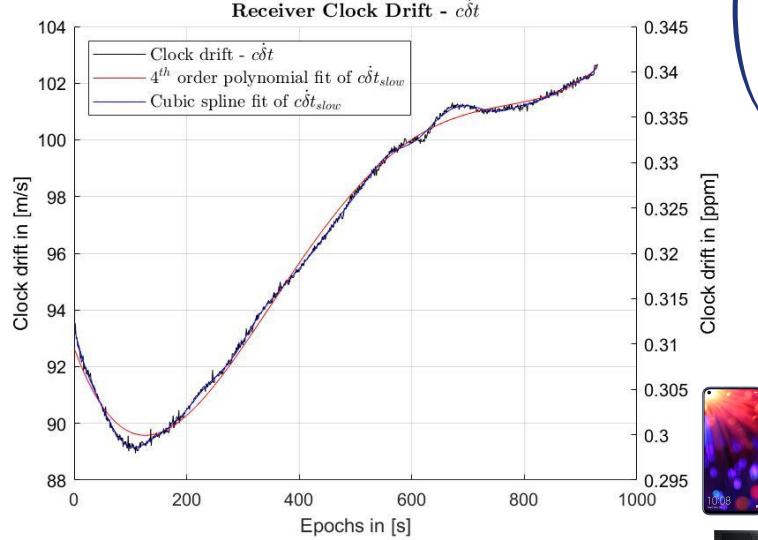
Doppler measurement model: $\dot{\rho}_i^{sv} = v_{x_i} \cdot a_{x_i} + v_{y_i} \cdot a_{y_i} + v_{z_i} \cdot a_{z_i} + c\dot{\delta t} + \varepsilon_{\dot{\rho}_i^s}$

Multiconstellation & Multifrequency

Setting that:

$$d_i^{sv} = \dot{\rho}_i^{sv} - v_i^{sv} * \overline{a_i^{sv}} \quad \text{thus}$$

Receiver Clock Drift - $c\dot{\delta t}$



Clock Drift for a Honor View 20



$$\begin{pmatrix} d_1 \\ d_2 \\ \vdots \\ d_i \end{pmatrix} = \begin{pmatrix} -a_{x_1} & -a_{y_1} & -a_{z_1} & 1 \\ -a_{x_2} & -a_{y_2} & -a_{z_2} & 1 \\ \vdots & \vdots & \vdots & \vdots \\ -a_{x_i} & -a_{y_i} & -a_{z_i} & 1 \end{pmatrix} \cdot \begin{pmatrix} v_{ux} \\ v_{uy} \\ v_{uz} \\ c\dot{\delta t} \end{pmatrix} + \begin{pmatrix} \varepsilon_{\dot{\rho}_1} \\ \varepsilon_{\dot{\rho}_2} \\ \vdots \\ \varepsilon_{\dot{\rho}_i} \end{pmatrix}$$

Solving this equation with a WLSE, we obtain $c\dot{\delta t}$.

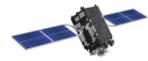
Hypothesis

Static scenario : User position is computed by a reference receiver

cδt modeling: $c\dot{\delta t} = c\dot{\delta t}^{fast} + c\dot{\delta t}^{slow}$

$c\dot{\delta t}^{slow}$ is modeled by a curve fitting

II) Methodology – DLL Jitter Estimation



Best available satellite signal

$$\text{Code model: } \rho_i^{sv} = r + c(t_{rx} - t_{tx}) + \varepsilon_{Iono} + \varepsilon_{Tropo} + \varepsilon_{Code} + \varepsilon_{Multipath}^{\rho}$$

$$\text{Phase model: } \varphi_i^{sv} = r + c(t_{rx} - t_{tx}) - \varepsilon_{Iono} + \varepsilon_{Tropo} + \Delta\varphi + \varepsilon_{Phase} + \varepsilon_{Multipath}^{\varphi}$$

$$\text{Code minus carrier (CMC) model: } \rho_i^{sv} - \varphi_i^{sv} = 2\varepsilon_{Iono} + \varepsilon_{Code} - \varepsilon_{Phase} + \Delta\varepsilon_{Multipath} + \Delta\varphi$$

CMC Time differenced model :

$$\frac{d}{dt}(\rho_i^{sv} - \varphi_i^{sv}) = \frac{d}{dt}(2\varepsilon_{Iono} + \varepsilon_{Code})$$

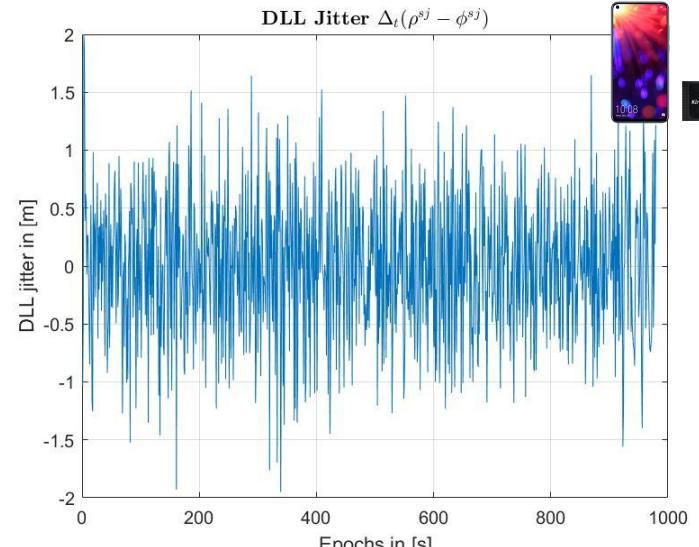
Hypothesis

Cycle slip detection: Android flag detection

Open sky scenario : $\Delta\varepsilon_{Multipath} \approx 0$

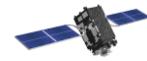
Error model : $\varepsilon_{Code} \gg \varepsilon_{Phase}$

Ionospheric variation: $\frac{d}{dt}(\varepsilon_{Iono}) \approx 0$



Galileo – PRN 21 – E1

II) Methodology – PLL/FLL Jitter Estimation



Best available satellite signal

$$\text{Phase model : } \varphi_i^{sv} = r + c(t_{rx} - t_{tx}) - \varepsilon_{Iono} + \varepsilon_{Tropo} + \Delta\varphi + \varepsilon_{Phase} + \varepsilon_{Multipath}^\varphi$$

Triple time differenced Phase model [5] :

$$\frac{d^3\varphi_i^{sv}}{dt^3} = \Delta t^3(r + c(t_{rx} - t_{tx})) - \Delta t^3(\varepsilon_{Iono}) + \Delta t^3(\varepsilon_{Tropo}) + \Delta\varphi + \varepsilon_{Phase} + \Delta t^3(\varepsilon_{Multipath}^\varphi)$$

Hypothesis

Static scenario : $\Delta t^3(r + c(t_{rx} - t_{tx})) \approx 0$

Open sky scenario: $\Delta\varepsilon_{Multipath} \approx 0$

Tropospheric variation: $\frac{d}{dt}(\varepsilon_{Tropo}) \approx 0$

Ionospheric variation: $\frac{d}{dt}(\varepsilon_{Iono}) \approx 0$

Cycle slip detection: Android flag detection

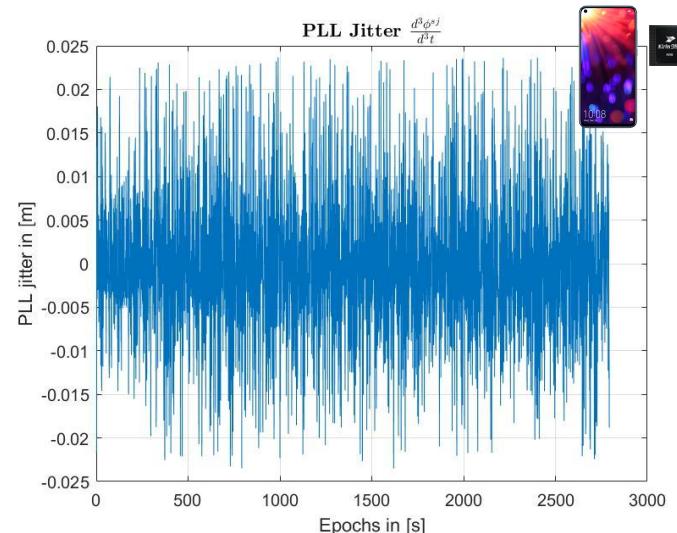


Figure: PLL Jitter for a Honor View 20



Galileo – PRN 21 – E1a



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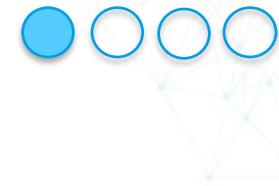
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III) Results Analysis – $c\delta t$

Results obtained by Lethova. et al [1]

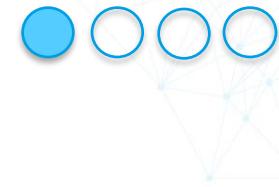
Smartphones Tested

Receiver	<i>Septentrio PolaRX5S*</i>	<i>u-blox M8T*</i>	<i>Samsung S8*</i>	Google Pixel 3	Honor View 20	Xiaomi Mi 8	Xiaomi Mi 9	Samsung S10+
$\sigma_{c\delta t} [m/s]$	< 0.03	0.14	0.18	4.72	0.61	0.16	3.93	0.44

* Results obtained by Lethova. et al [1]

0.42 0.25 2nd Phone

0.26 3rd Phone



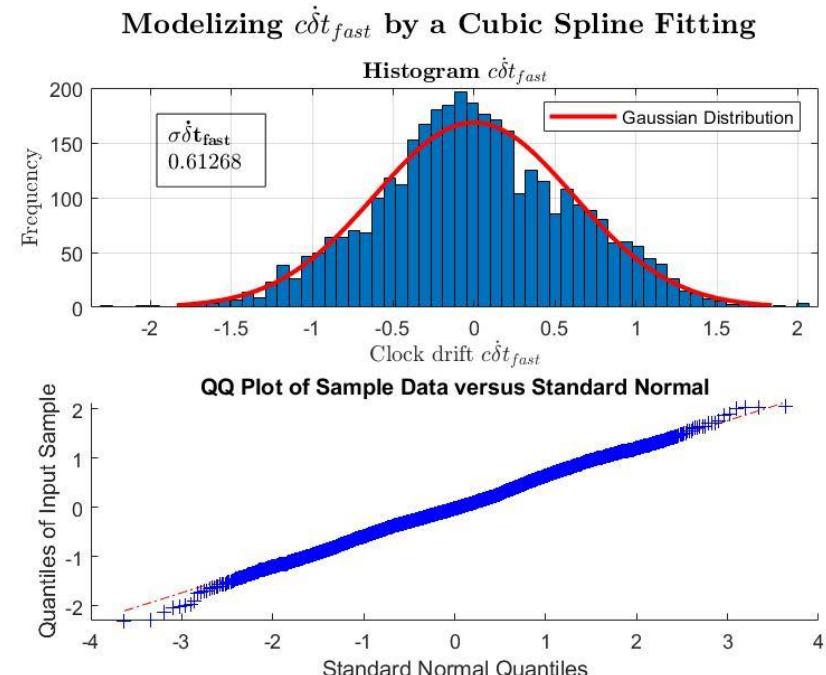
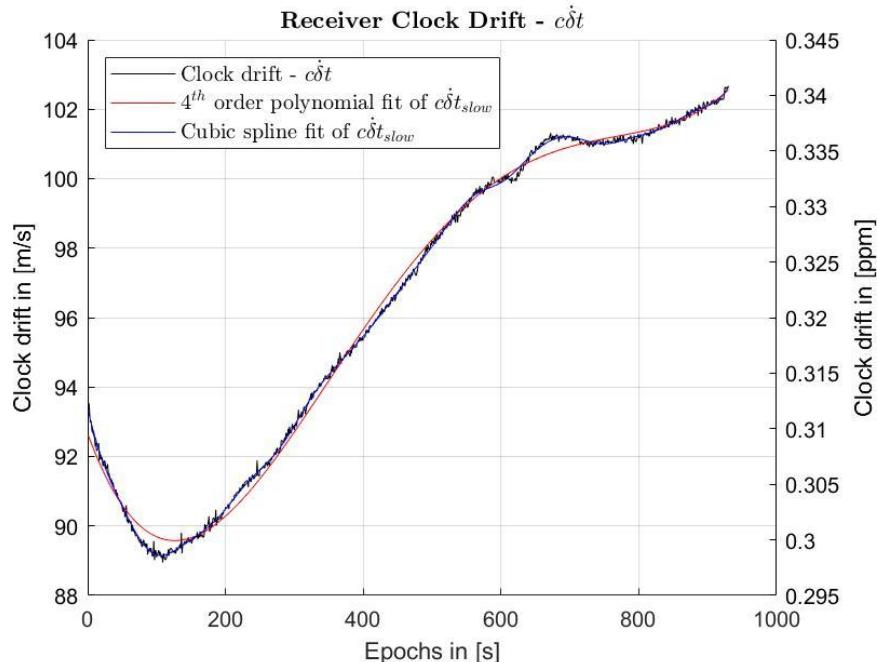
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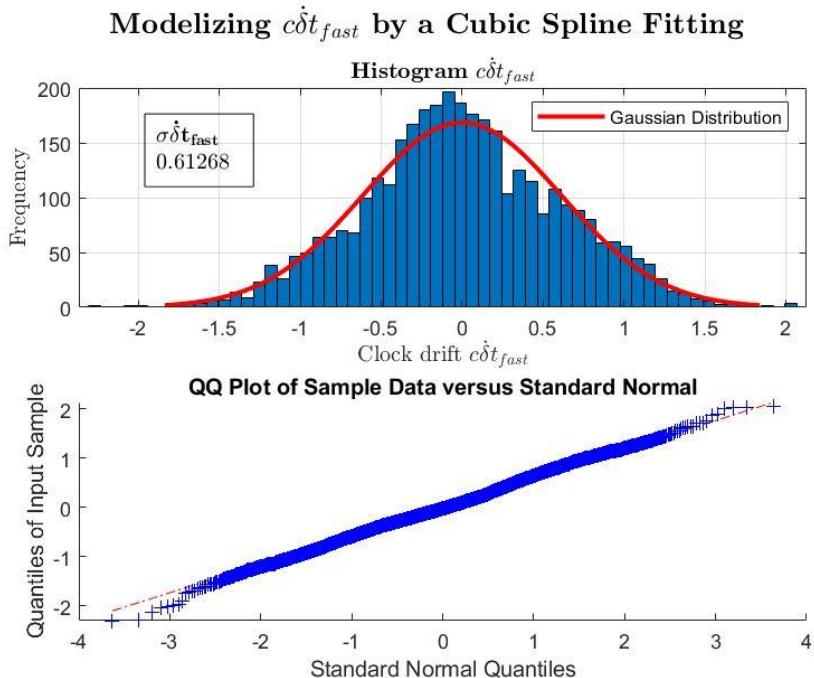
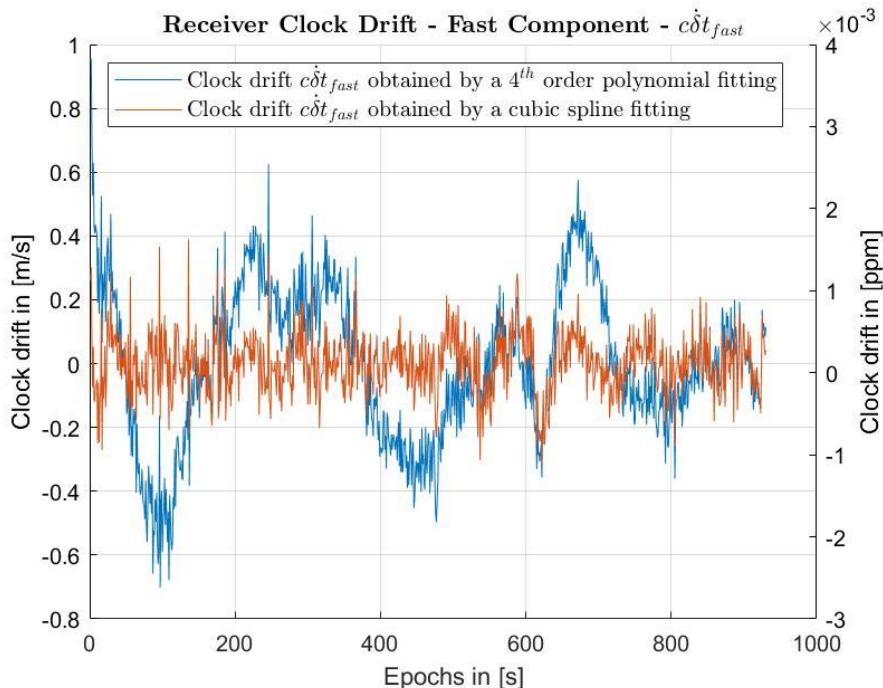
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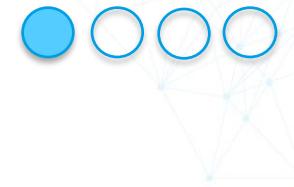
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III) Results Analysis – $c\delta t$



Comparing phones with no phase measurements

Receiver	<i>Septentrio PolaRX5S*</i>	<i>u-blox M8T*</i>	<i>Samsung S8*</i>	Qualcomm Snapdragon 835 	Qualcomm Snapdragon 845 	HiSilicon Kirin 980 	Broadcom BCM47755 	Qualcomm Snapdragon 855 	Qualcomm Snapdragon 855
$\sigma_{c\delta t} [m/s]$	< 0.03	0.14	0.18	4.72	0.61	0.16	3.93	0.44	

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III) Results Analysis – $c\delta t$



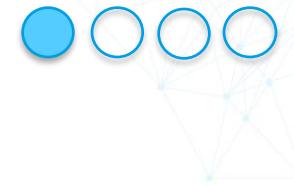
Comparing phones' performance to commercial GNSS receivers

Receiver	<i>Septentrio PolaRX5S*</i>	<i>u-blox M8T*</i>	<i>Samsung S8*</i>	<i>Google Pixel 3</i>	<i>Honor View 20</i>	<i>Xiaomi Mi 8</i>	<i>Xiaomi Mi 9</i>	<i>Samsung S10+</i>
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III) Results Analysis – $c\delta t$



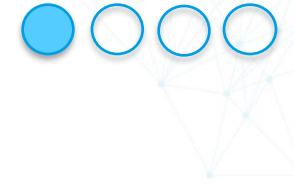
Comparing similar smartphones

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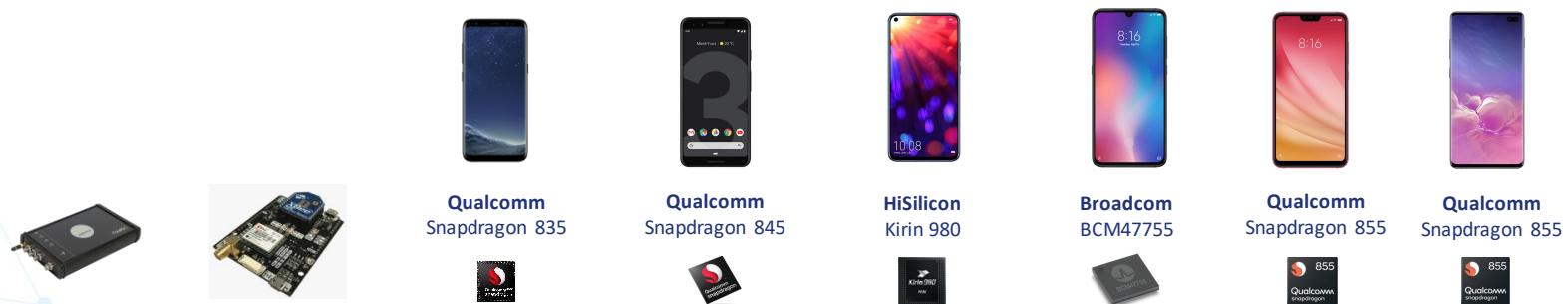
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III) Results Analysis – $c\delta t$



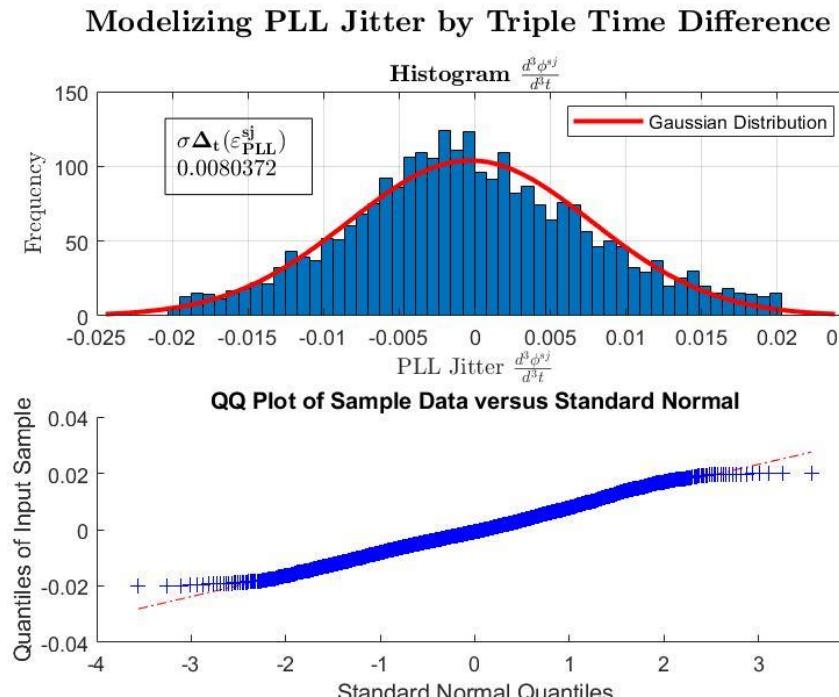
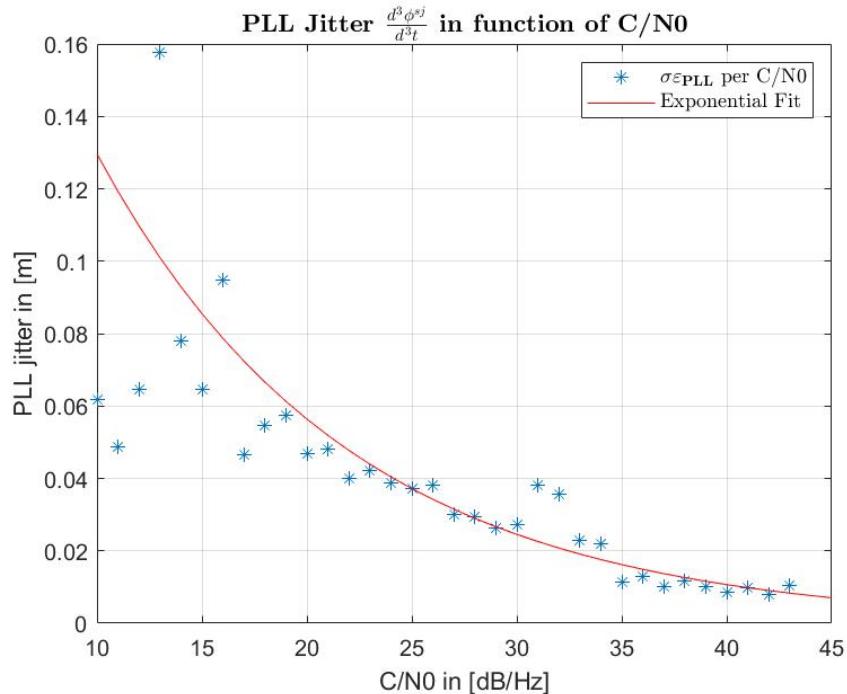
Comparing similar chipset manufacturer



Receiver	<i>Septentrio PolaRX5S*</i>	<i>u-blox M8T*</i>	<i>Samsung S8*</i>	<i>Google Pixel 3</i>	<i>Honor View 20</i>	<i>Xiaomi Mi 8</i>	<i>Xiaomi Mi 9</i>	<i>Samsung S10+</i>
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* Results obtained by Lethova. et al [1]

III) Results Analysis – σ_{PLL}



Receiver	Septentrio PolaRX5S*	u-blox M8T*	Samsung S8*	Google Pixel 3	Honor View 20	Xiaomi Mi 8	Xiaomi Mi 9	Samsung S10+
σ_{PLL} [m]	0.002	0.003	0.8	Nan	0.008	0.018	Nan	0.003

* Results obtained by Lethova. et al [1]

III) Results Analysis – σ_{PLL}

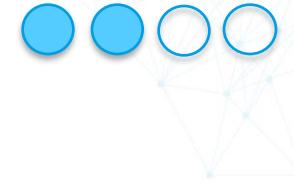


Comparing phones' performance to commercial GNSS receivers

								
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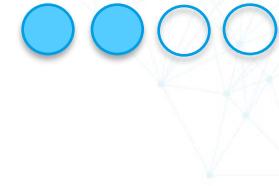
III) Results Analysis – σ_{PLL}



Comparing similar smartphones

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* Results obtained by Lethova. et al [1]					0.008	0.018		
					0.008	0.018	2 nd Phone	
						0.014	3 rd Phone	

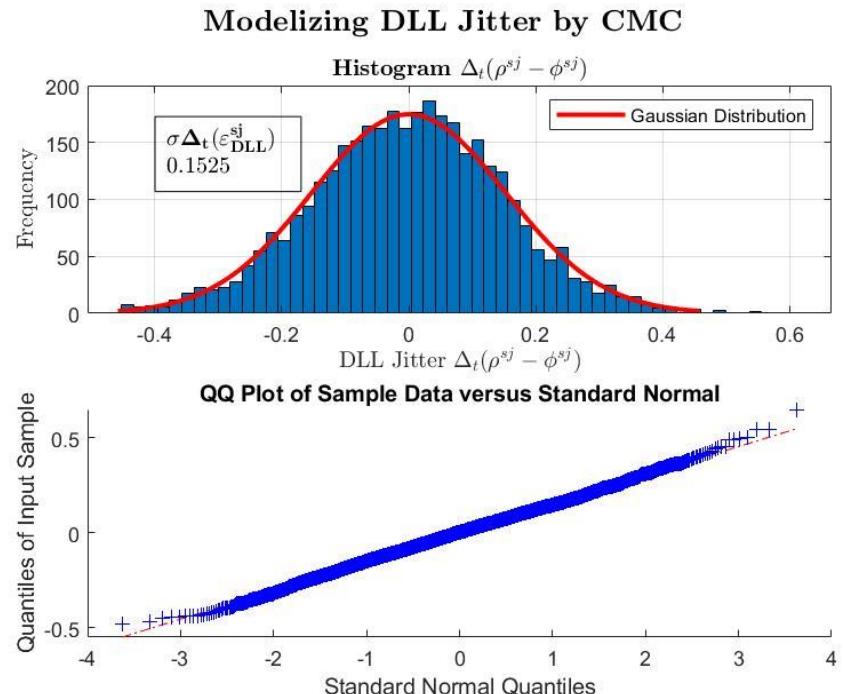
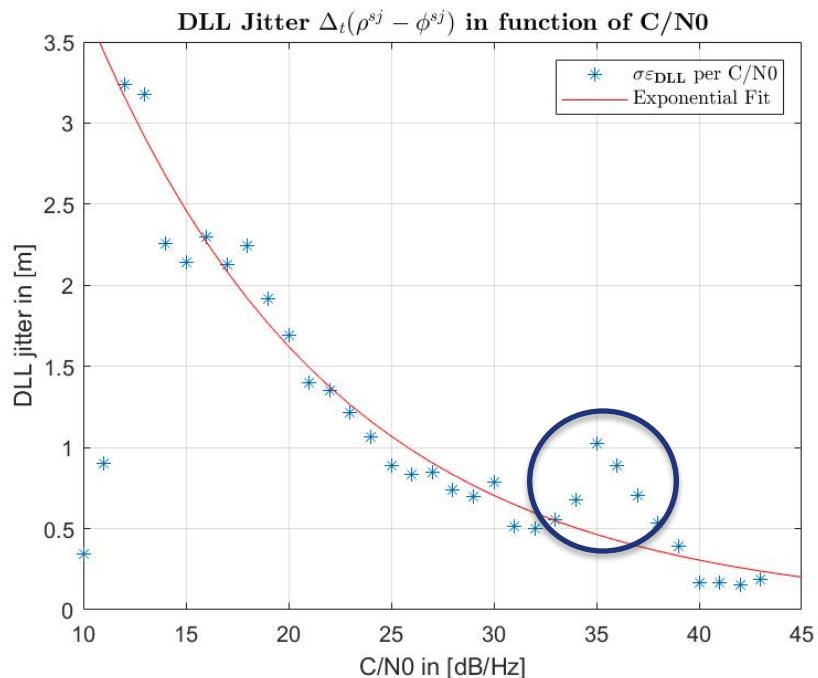
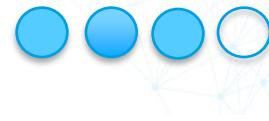
III) Results Analysis – σ_{PLL}



Comparing similar chipset manufacturer

Receiver	<i>Septentrio PolaRX5S*</i>	<i>u-blox M8T*</i>	<i>Samsung S8*</i>	<i>Google Pixel 3</i>	<i>Honor View 20</i>	<i>Xiaomi Mi 8</i>	<i>Xiaomi Mi 9</i>	<i>Samsung S10+</i>
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TéSA	cnes	International Navigation Conference INC 2019 Centre National d'Etudes Spatiales	18-21 November 2019 Edinburgh International Conference Centre, UK			0.014	3 rd Phone	
www.enac.fr								17 / 22

III) Results Analysis – σ_{DLL}



Receiver	Septentrio PolarX5S*	u-blox M8T*	Samsung S8*	Google Pixel 3	Honor View 20	Xiaomi Mi 8	Xiaomi Mi 9	Samsung S10+
σ_{DLL} [m]	0.049	0.22	6.42	1.88	0.152	0.68	0.24	0.97

* Results obtained by Lethova. et al [1]

III) Results Analysis – σ_{DLL}



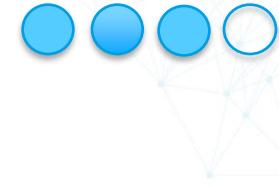
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2nd Phone3rd Phone



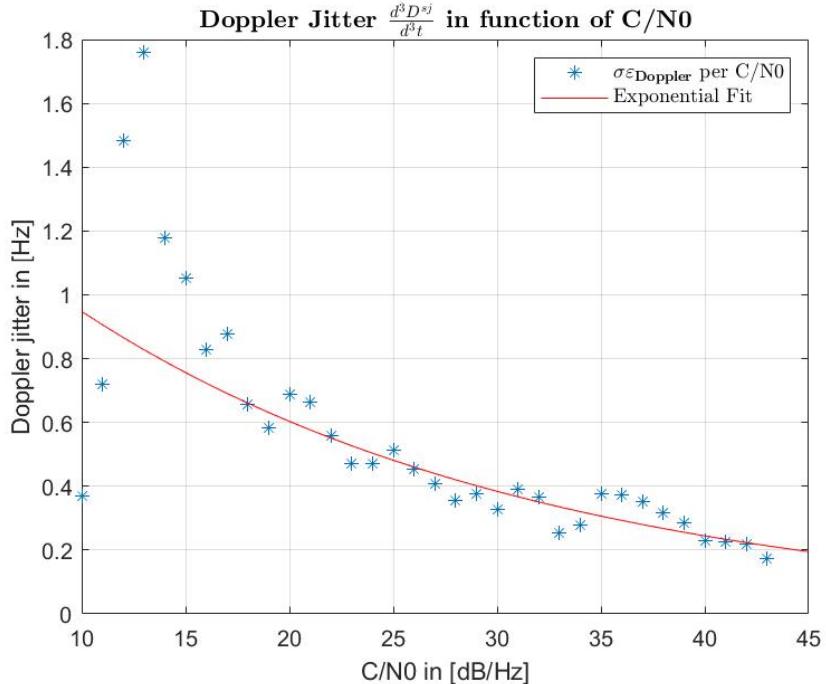
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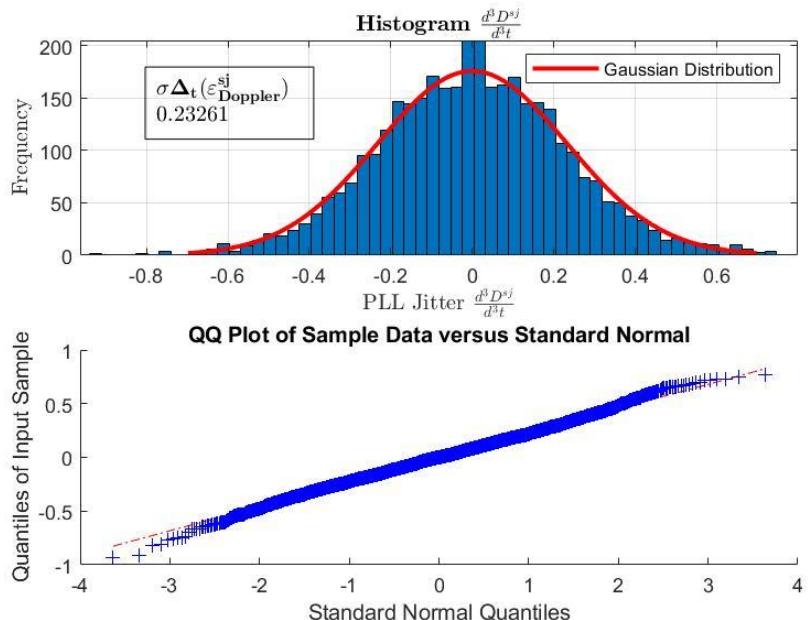
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Receiver	Septentrio PolaRX5S*	u-blox M8T*	Qualcomm Snapdragon 835	Qualcomm Snapdragon 845	HiSilicon Kirin 980	Broadcom BCM47755	Qualcomm Snapdragon 855	Qualcomm Snapdragon 855
$\sigma_{DLL} [m]$	0.049	0.22	6.42	1.88	0.152	0.68	0.24	0.97
<p>* Results obtained by Lethova. et al [1]</p> <p>2nd Phone</p> <p>3rd Phone</p>								

III) Results Analysis – $\sigma_{Doppler}$



Modelizing Doppler Jitter by Triple Time Difference

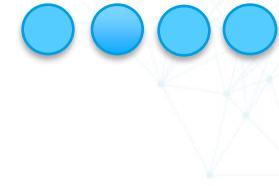


Receiver	Septentrio PolaRX5S*	u-blox M8T*	Samsung S8*	Google Pixel 3	Honor View 20	Xiaomi Mi 8	Xiaomi Mi 9	Samsung S10+
σ_{Dop} [Hz]	N/A	N/A	N/A	4.79	0.23	0.10	1.27	0.05
					0.19	0.11	2 nd Phone	
						0.14	3 rd Phone	

* Results obtained by Lethova. et al [1]



III) Results Analysis – $\sigma_{Doppler}$



Comparing similar smartphones

Receiver	<i>Septentrio PolaRX5S*</i>	<i>u-blox M8T*</i>	<i>Samsung S8*</i>	<i>Google Pixel 3</i>	<i>Honor View 20</i>	<i>Xiaomi Mi 8</i>	<i>Xiaomi Mi 9</i>	<i>Samsung S10+</i>
σ_{Dop} [Hz]	N/A	N/A	N/A	4.79	0.23 0.19 0.14	0.10	1.27	0.05

* Results obtained by Lethova. et al [1]



OUTLINE

I. Introduction

- a. Context
- b. Motivations
- c. Objectives

II. Methodology

- a. Experimentation Protocol
- b. Clock Drift Estimation
- c. DLL Jitter Estimation
- d. PLL & Doppler Jitter Estimation

III. Results Analysis

IV. Conclusions



IV) Conclusions

- Smartphone embedded GNSS receivers have been successfully characterized for a nominal performance scenario (open sky conditions).
- Estimated parameters for similar phones (same model) tend to be equals and therefore can be modeled.
- Further analysis need to be made in order to draw a clear correlation between the estimated parameters (**DLL, PLL, Doppler jitters & Clock Drift**) and GNSS chipset brands/models.
- A characterization method will be established for urban canyons environment
- Android Flags need a deeper investigation (cycle slip detection)



IV) Conclusions - References



- [1] Lehtola, V. V., Söderholm, S., Koivisto, M., & Montloin, L. (2019). Exploring GNSS crowdsourcing feasibility: Combinations of measurements for modeling smartphone and higher end GNSS receiver performance. *Sensors (Switzerland)*, 19(13), 1-17. [3018]. <https://doi.org/10.3390/s19133018>
- [2] Gioia, Ciro & Damy, Sophie & Borio, Daniele. (2019). Precise Time in your Pocket: Timing Performance of Android Phones. 137-148. 10.33012/2019.16749.
- [3] Lachapelle, Gérard & Gratton, Paul & Horrelt, Jamie & Lemieux, Erica & Broumandan, Ali. (2018). Evaluation of a Low Cost Hand Held Unit with GNSS Raw Data Capability and Comparison with an Android Smartphone. *Sensors*. 18. 4185. 10.3390/s18124185.
- [4] Garello, Roberto & Samson, Jaron & Spirito, Maurizio & Wymeersch, Henk. (2012). Peer-to-Peer Cooperative Positioning: Part II: Hybrid Devices with GNSS & Terrestrial Ranging Capability. *Inside GNSS*.
- [5] De Bakker, Peter & Samson, Jaron & Joosten, P & Spelat, M & Martin, Hollreiser & Ambrosius, B. (2006). EFFECTS OF RADIO FREQUENCY INTERFERENCE ON GNSS RECEIVER OUTPUT.



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Questions ?



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Statistical Analysis of Android GNSS Raw Data Measurements in an Urban Environment for Smartphone Collaborative Positioning Methods

[1,2] [2] [3]

T. Verheyde, A. Blais, C. Macabiau, F.X. Marmet

[1] Telecommunication Research Laboratory – TéSA, Toulouse, France.

[2] École Nationale Aviation Civile (ENAC) - Université de Toulouse, France

[3] Centre National d'Etudes Spatiales (CNES) – Toulouse, France

[thomas.verheyde],[blais],[macabiau]@recherche.enac.fr
francois-xavier.marmet@cnes.fr