



Satellite Navigation

AAE4203 – Guidance and Navigation

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Global Navigation Satellite System (GNSS)

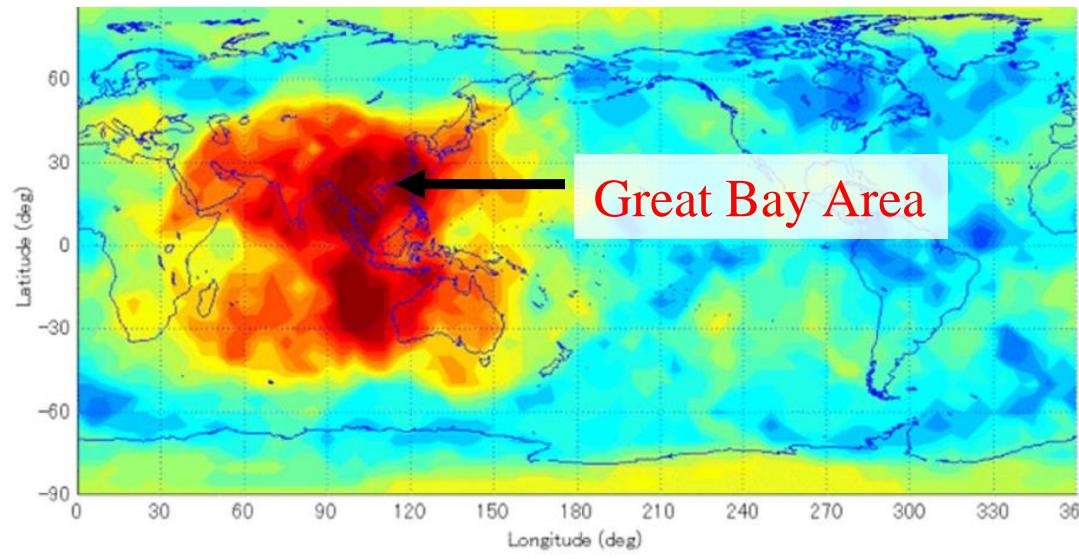
- > US Global Positioning System GPS
- > Russia GLONASS
- > China Beidou
- > EU Galileo





New Era of GNSS

- > GPS, GLONASS, Galileo and Beidou
- > Visible GNSS satellites with mask angle > 30° in 2020





GNSS in Autonomous Driving

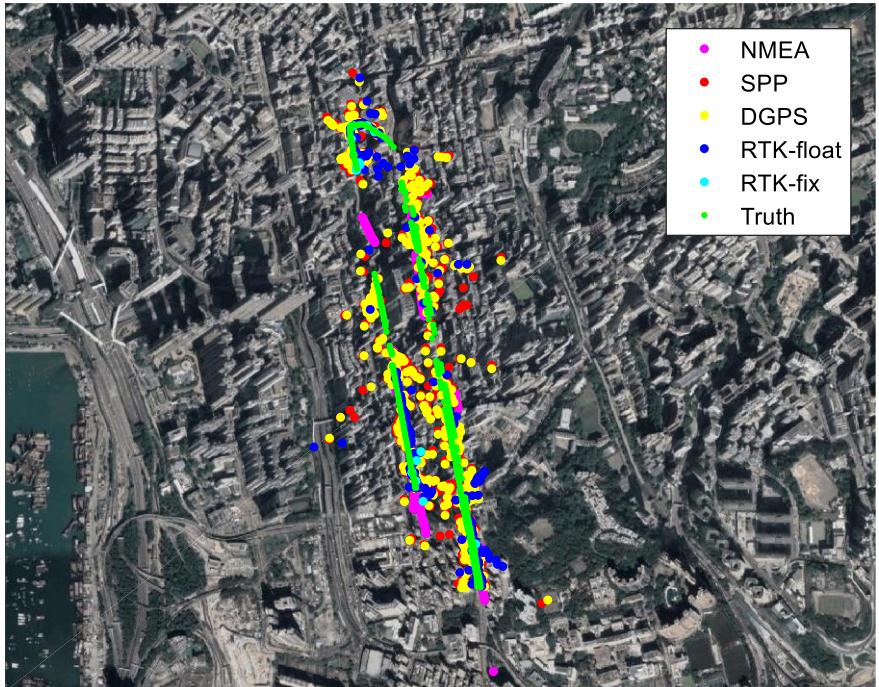
Model					
Company Name	Waymo	Ford	Tesla	Nuro	Oxbotica
Positioning Solution	GNSS-RTK/INS/LiDAR/HD Map	GNSS-RTK/INS/LiDAR/HD Map	GNSS/INS/LiDAR/HD Map	GNSS-RTK/INS/LiDAR/HD Map	GNSS-RTK/INS/LiDAR/HD Map
Tested Scenario	Open area/sub-urban	Open area/sub-urban	Open area/sub-urban	Open area/sub-urban	Open area/sub-urban
Level of Automation	L5	L5	L2.5	L5	L5

ADAS*: Advanced Driving Assistant System



GNSS in Urban Canyons

SPP*: Single Point Positioning
RTK*: Real-time Kinematic



nSat	Full nSat	Ratio	HDOP	VDOP	XDOP	YDOP
8.50	21.70	39.03%	2.82	4.69	1.87	1.85

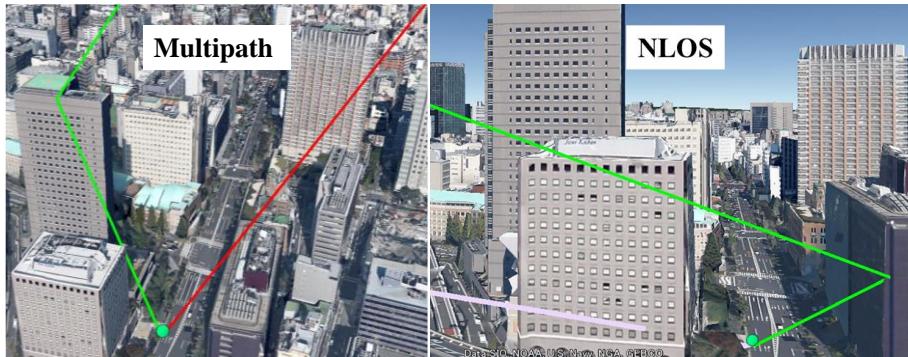
Type	Availability	2D Error	X Error	Y Error	2D STD	X STD	Y STD
NMEA	91.43%	84.74	78.75	16.71	85.11	87.68	16.01
SPP	76.94%	51.49	31.71	32.28	61.28	49.48	43.73
DGNS S	72.07%	45.87	28.91	28.62	57.41	46.54	39.74
RTK FLOA T	31.40%	28.91	14.69	21.66	44.59	30.13	35.10
RTK FIX	2.09%	10.10	5.88	7.12	12.87	9.89	9.25



Background

Problem 1: Poor GNSS measurements quality:

- NLOS receptions
- Multipath effects
- ...

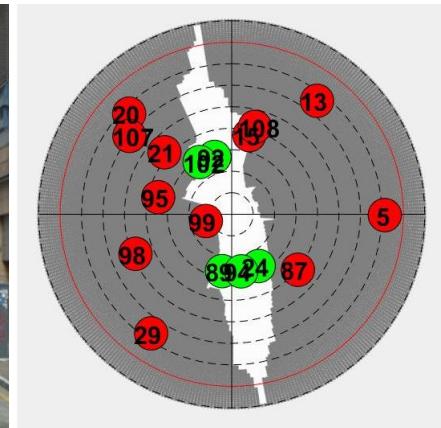


Hsu, 2016

Hsu, 2016

Problem 2: Poor satellite geometry:

- Limited satellites numbers
- Hard to get fixed during ambiguity resolution



Satellite geometry in Urban

[1] J. Breßler, etc, "GNSS positioning in non-line-of-sight context—A survey," *ITSC 2016*.

[2] Hsu, Li-Ta, etc. "3D building model-based pedestrian positioning method using GPS/GLONASS/QZSS and its reliability calculation" *GPS Sharing the Future 2016* 運思維・成就未來



Outline

- GPS Overview
- Receiver Position Estimation
- GPS Performance
- Improved GPS Performance



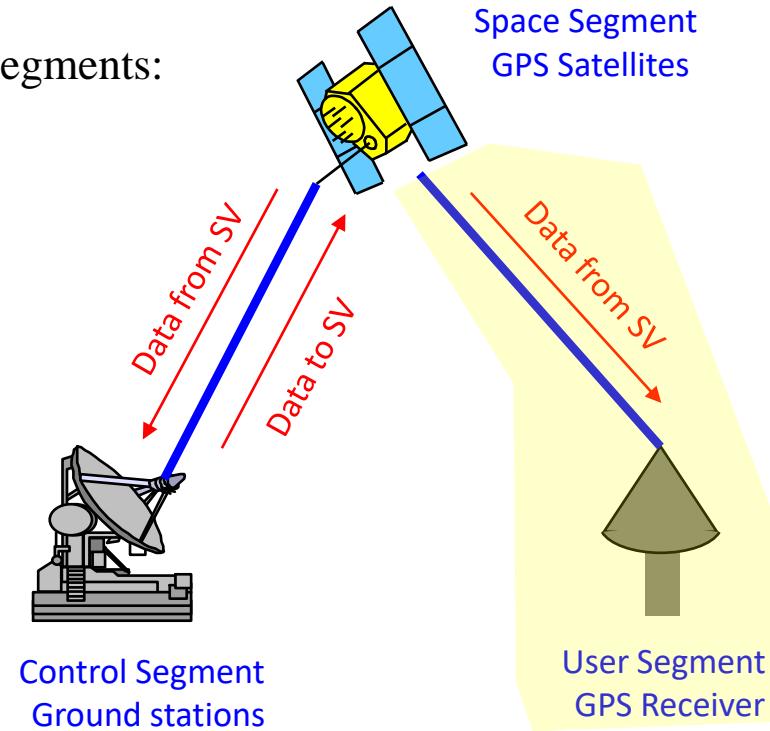
GPS Overview



System Configuration of GPS

> Satellite navigation system is consisted of three segments:

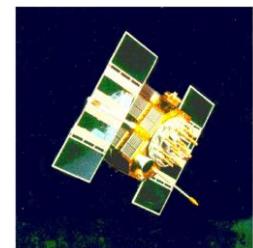
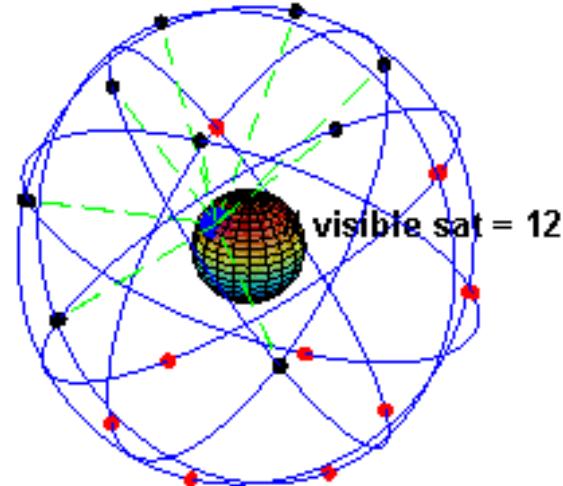
1. Control segment
 - Command infrequent small maneuvers to maintain orbit
 - Keep the synchronization of GPS time
2. Space segment (broadcasting)
 - 31+ medium earth orbit (MEO) satellites
 - 6 orbit planes
3. User segment
 - Antenna
 - A/D converter
 - Signal processing
 - **Positioning algorithm**





Space Segment

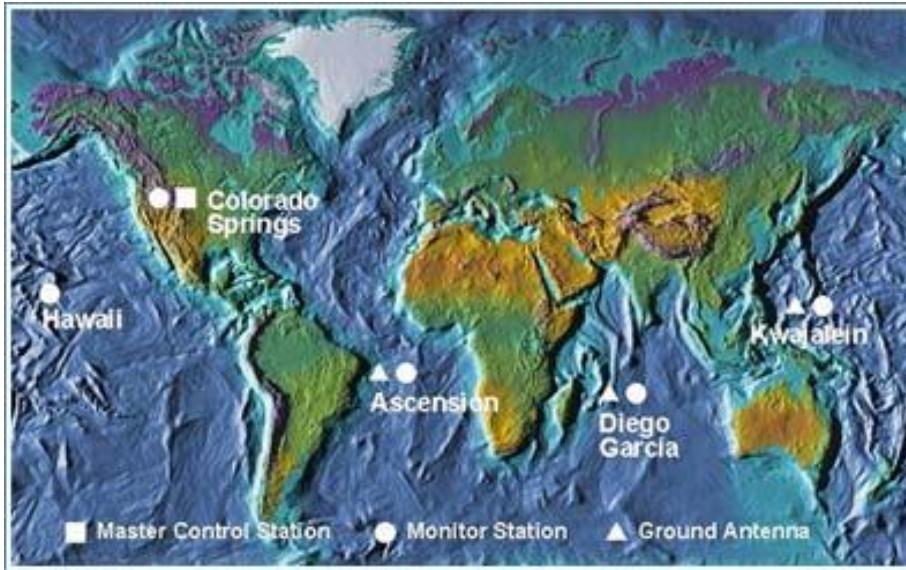
- > Able to see 5 to 8 satellites at any point on the earth
- > Each satellite has atomic clocks
- > 32 satellites in 6 orbital planes (5-6 satellite per orbit)
- > 20,200 km altitude, 55 degree inclination
- > Two revolutions per sidereal day
- > One sidereal day is 23 hours 56 minutes 4.091 seconds
- > SVs repeat more or less the same ground track on each day





Control Segment

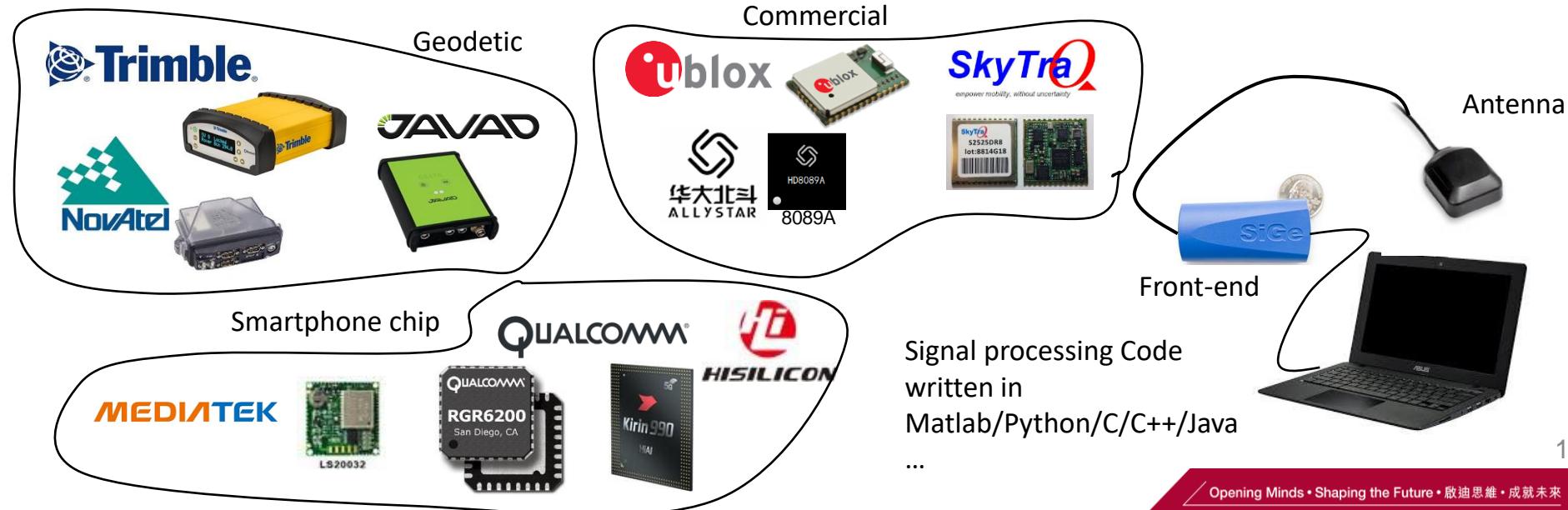
- Monitor stations measure signals from SVs and compute precise orbital and clock corrections data for each SV.
- Master Control station uploads orbital & clock data to SVs.



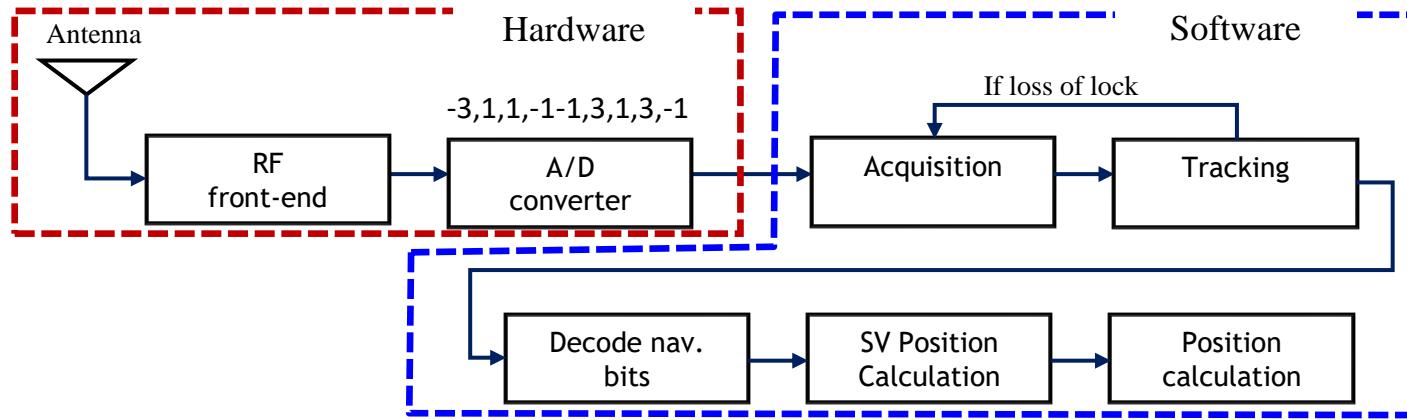


User Segment

- > GPS receivers with quartz clocks can convert SV signals into position and time estimates and derive velocity.
- > Four satellites are required to compute the four dimensions of X, Y, Z (position) and Time.



Architecture of GPS Software Define Receiver



- > **Acquisition:** to determine visible satellites, coarse values of carrier frequency, and code delay of received signals.
- > **Tracking:** to refine these values and keep track and demodulate navigation data from satellites.
- > **Navigation Data Decode:** to obtain Pseudorange, GPS time, Ephemeris, Almanac, and Klobuchar information.
- > **User Positioning:** to calculate the receiver position via estimating technique.

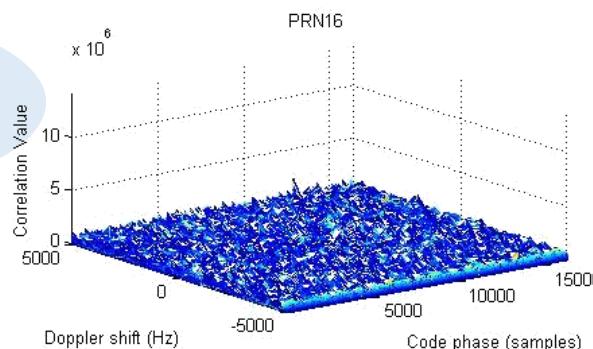
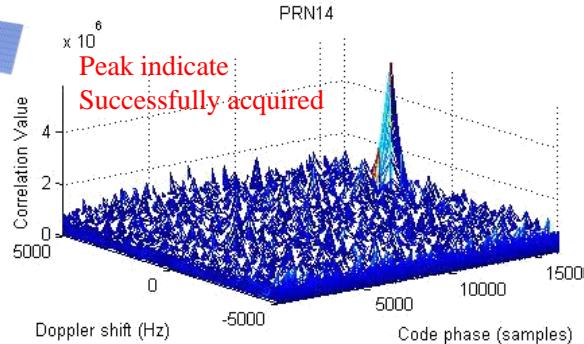
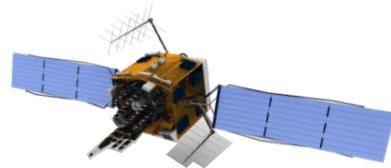


What is signal acquisition?

Lots of satellite in the sky!
Which is this one!?



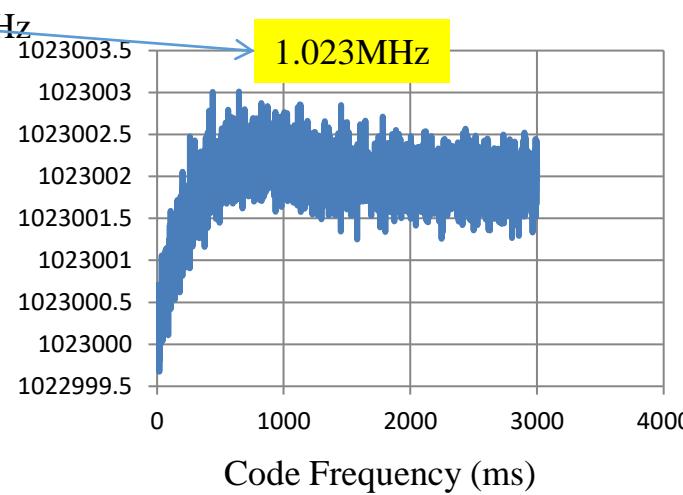
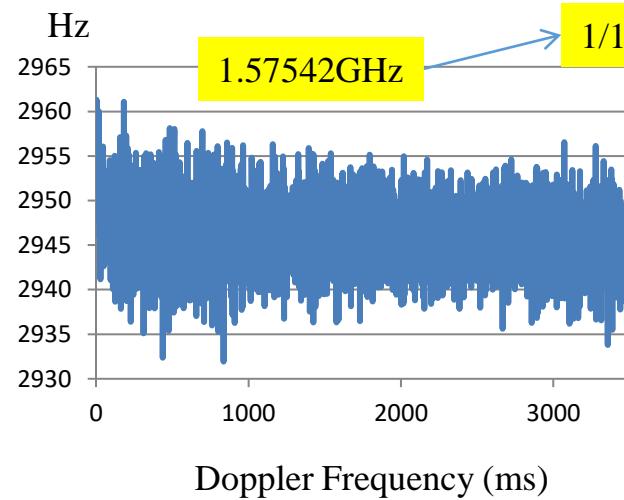
Don't worry!
Acquisition process could help you to identify which satellite it is!





Purpose of Tracking

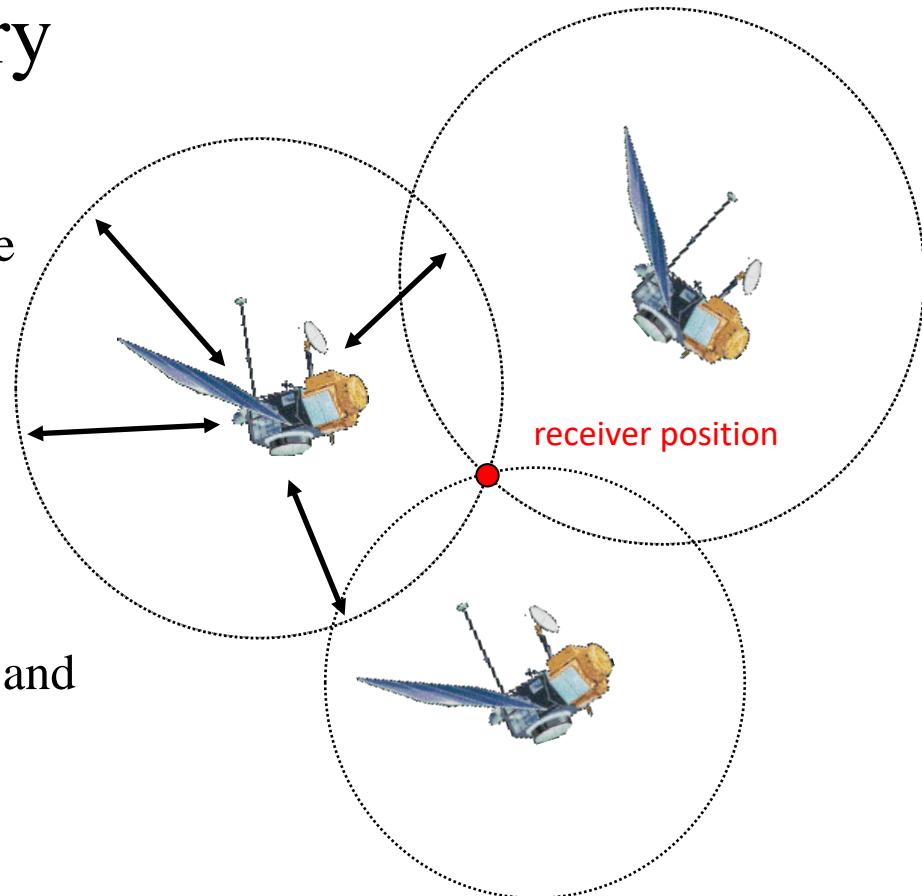
> **Tracking** is to continuously track the code-phase and Doppler frequency of GNSS signals. **Loop filter** is used in the tracking loop.





GNSS Positioning Theory

- > GNSS Positioning is based on the triangulation method.
- > Known information obtained from the signal processing
 - Position of satellites
 - Distance between satellites and receiver (Pseudoranges)
- > The time difference between satellite and receiver is also estimated in the positioning process.
- > At least 4 satellites are required.





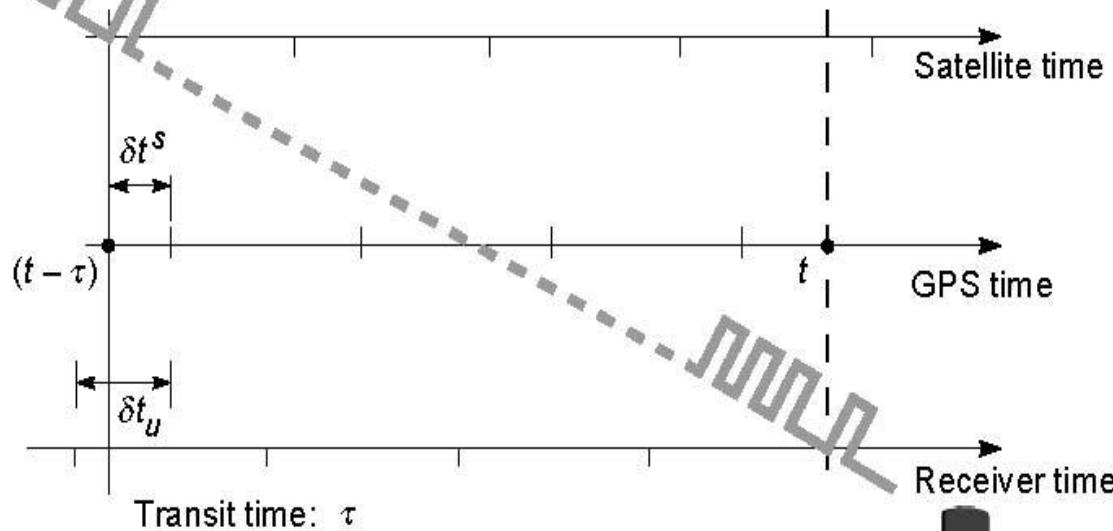
Receiver Position Estimation



Code Phase Measurement (Pseudorange)



3 clocks must be considered.



Transit time: τ

Pseudo-transit time: $\tau + (\delta t_u - \delta t^s)$

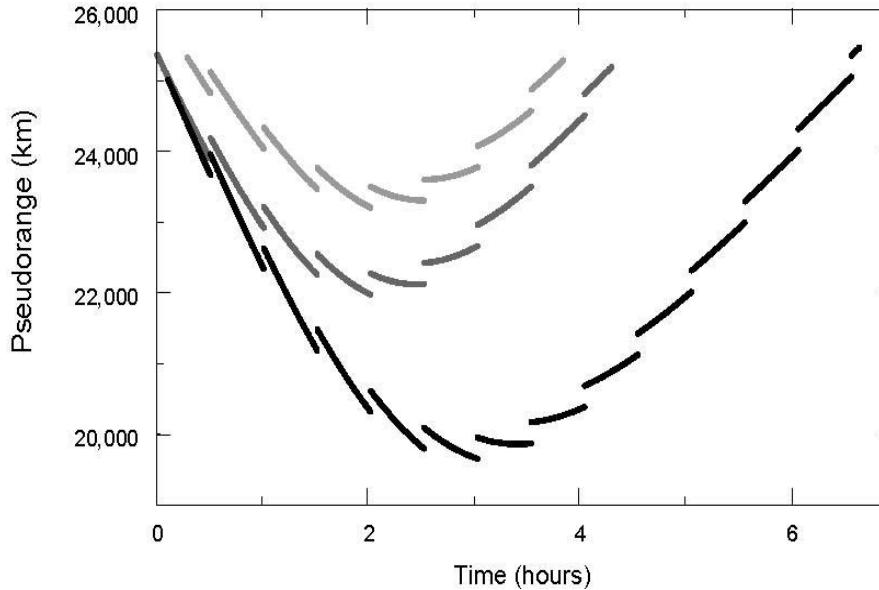
Pseudorange: $c[\tau + (\delta t_u - \delta t^s)]$



3 clocks are not synchronized.
Satellite clock error can be
corrected using navigation
message.
User clock error can be
estimated as an unknown
parameter in the positioning.



Real Pseudorange Measurements



The variations of pseudo-range are mainly due to the satellite motion and earth rotation. Several gaps in all satellites are due to receiver clock offset. Receiver usually offset their own clock because the receiver clock error continues to increase.



Position Estimation

- > Satellite position in the transmitted time “ $t - \tau$ ”.
- > Pseudo-range between satellite and user in the received time “ t ”

$$\rho^{(k)}(t) = r^{(k)}(t, t - \tau) + c[\delta t_u(t) - \delta t^{(k)}(t - \tau)] + I^{(k)}(t) + T^{(k)}(t) + \varepsilon_{\rho}^{(k)}(t)$$

Clock Errors

The reason why we call “pseudo-range” is from second term.

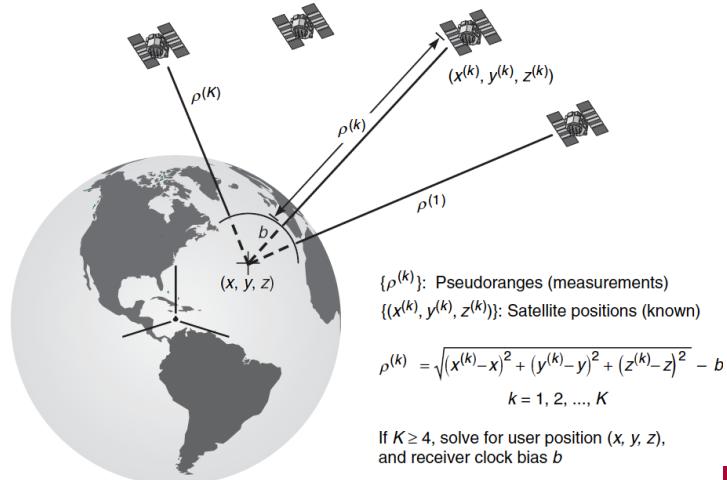
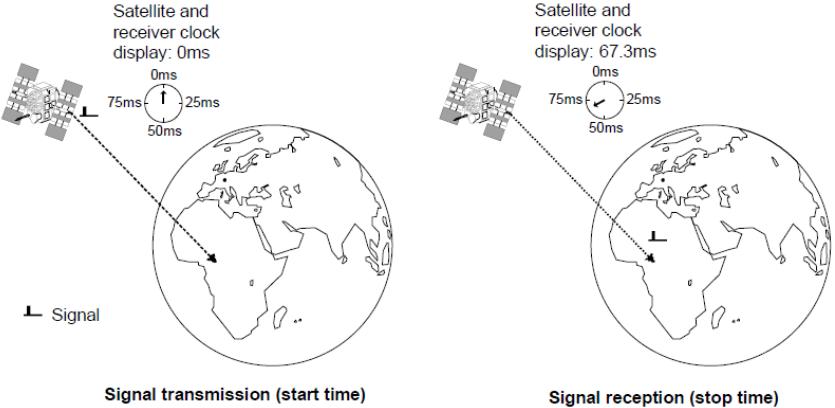
Satellite clock and Receiver clock are not synchronized.

How many unknown parameters do we have ?



x, y, z, receiver clock offset

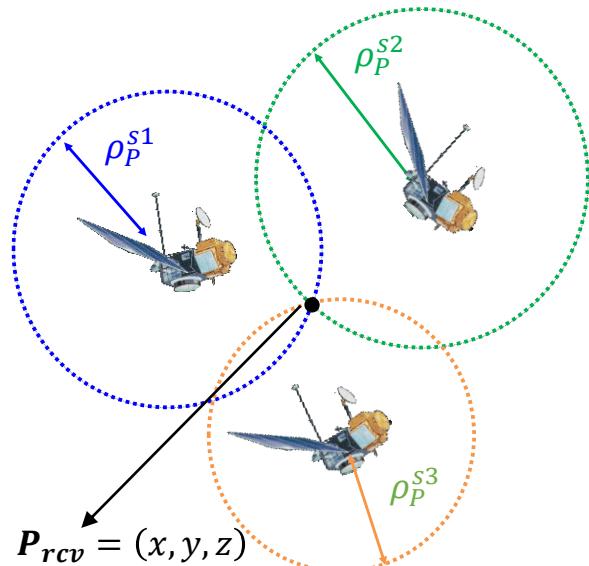
- > Satellite clock is corrected using navigation data.
- > Fortunately, receiver clock offset is **same** for all satellites.
- > Therefore, unknown variables should be solved are **x, y, z and receiver clock offset**.



If $K \geq 4$, solve for user position (x, y, z) ,
and receiver clock bias b

Triangulation Positioning Theory

Goal: Solve x,y,z!



Known Information

$$\rho_P^{s1} = \sqrt{(x^{s1} - x)^2 + (y^{s1} - y)^2 + (z^{s1} - z)^2} + b$$

$$\rho_P^{s2} = \sqrt{(x^{s2} - x)^2 + (y^{s2} - y)^2 + (z^{s2} - z)^2} + b$$

$$\rho_P^{s3} = \sqrt{(x^{s3} - x)^2 + (y^{s3} - y)^2 + (z^{s3} - z)^2} + b$$

Pseudorange
measurement

Satellite Positions

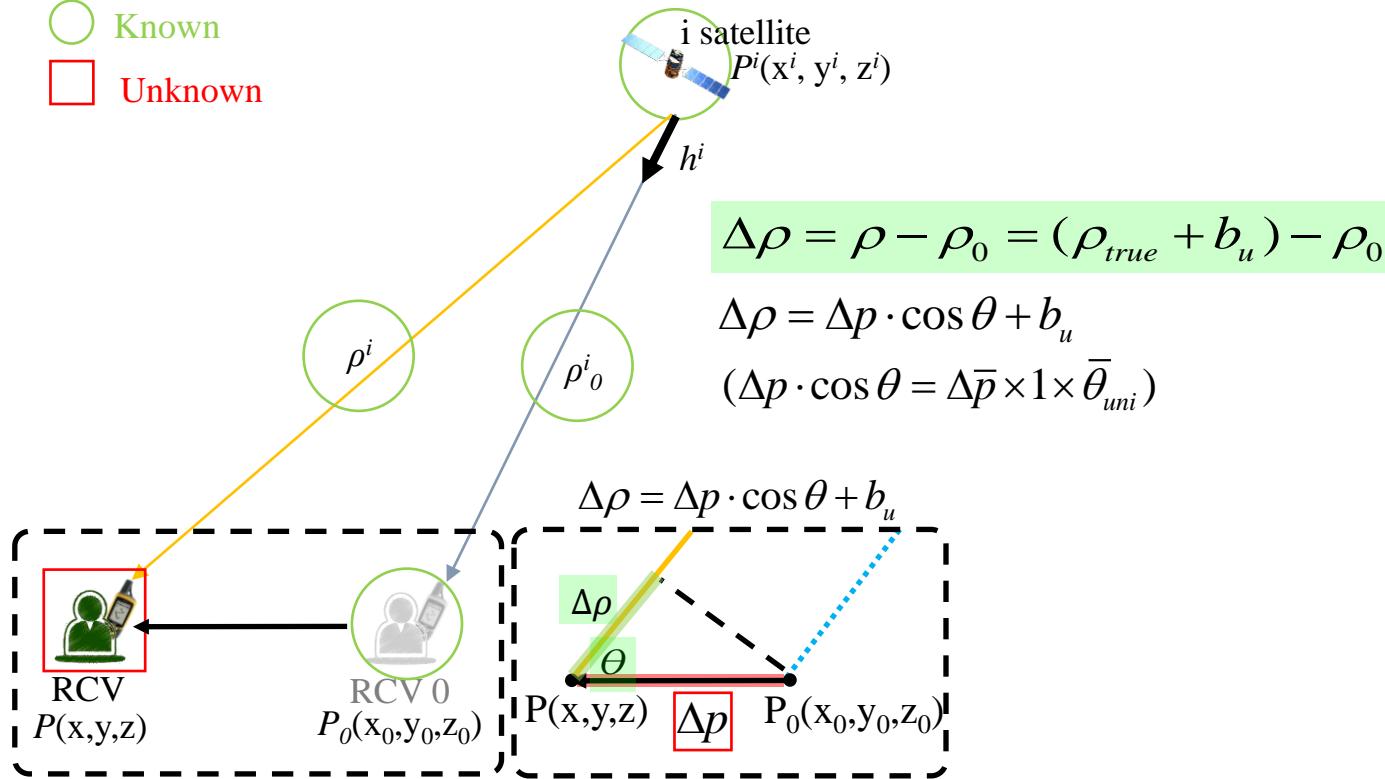
3 equations with 4 unknowns! Therefore, 4 satellites are required

Can we solve? YES! How!? Mathematically, linearize the equation by Taylor Series Expansion at a point we GUESS.



Positioning using Least Square Estimation

Known
Unknown





Positioning using Least Square Estimation

$$\Delta\rho = \rho - \rho_0 = (\rho_{true} + b_u) - \rho_0$$

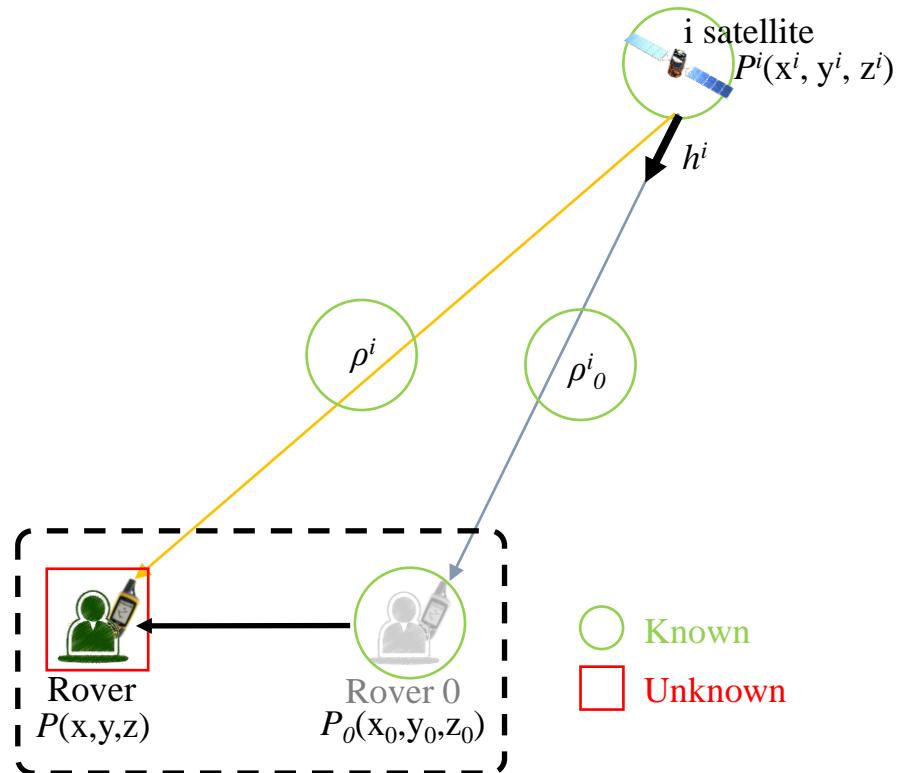
$$\Delta\rho = \Delta p \cdot \cos\theta + b_u \quad (\Delta p \cdot \cos\theta = \Delta \bar{p} \times 1 \times \bar{\theta}_{uni})$$

$$\Delta\rho^i = \begin{bmatrix} (x^i - x_0) & (y^i - y_0) & (z^i - z_0) & 1 \\ \rho_0^i & \rho_0^i & \rho_0^i & 1 \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \\ \Delta b \end{bmatrix}$$

$$\Delta\rho = G\Delta p \quad (\Delta p = G^{-1}\Delta\rho)$$

$$\begin{bmatrix} \Delta p_x \\ \Delta p_y \\ \Delta p_z \\ \Delta b_u \end{bmatrix} = \begin{bmatrix} x - x_0 \\ y - y_0 \\ z - z_0 \\ b_u - b_{u,0} \end{bmatrix}$$

$$\begin{bmatrix} x_n \\ y_n \\ z_n \\ b_{u,n} \end{bmatrix} = \begin{bmatrix} x_{n-1} \\ y_{n-1} \\ z_{n-1} \\ b_{u,n-1} \end{bmatrix} + \begin{bmatrix} \Delta p_{x,n-1} \\ \Delta p_{y,n-1} \\ \Delta p_{z,n-1} \\ \Delta b_{u,n-1} \end{bmatrix}$$



$$\Delta \rho = \rho_{meas} - \rho_0 - b_u \quad \text{where } \rho_0^{(i)} = \|P^{(i)} - P_0\|$$

Unknown

$$\Delta \rho = G \Delta p$$

$$\begin{bmatrix} \Delta \rho^1 \\ \Delta \rho^2 \\ \Delta \rho^3 \\ \Delta \rho^4 \end{bmatrix} = \begin{bmatrix} \frac{(x^1 - x_0)}{\rho_0^1} & \frac{(y^1 - y_0)}{\rho_0^1} & \frac{(z^1 - z_0)}{\rho_0^1} & 1 \\ \frac{(x^2 - x_0)}{\rho_0^2} & \frac{(y^2 - y_0)}{\rho_0^2} & \frac{(z^2 - z_0)}{\rho_0^2} & 1 \\ \frac{(x^3 - x_0)}{\rho_0^3} & \frac{(y^3 - y_0)}{\rho_0^3} & \frac{(z^3 - z_0)}{\rho_0^3} & 1 \\ \frac{(x^4 - x_0)}{\rho_0^4} & \frac{(y^4 - y_0)}{\rho_0^4} & \frac{(z^4 - z_0)}{\rho_0^4} & 1 \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \\ b_u \end{bmatrix}$$

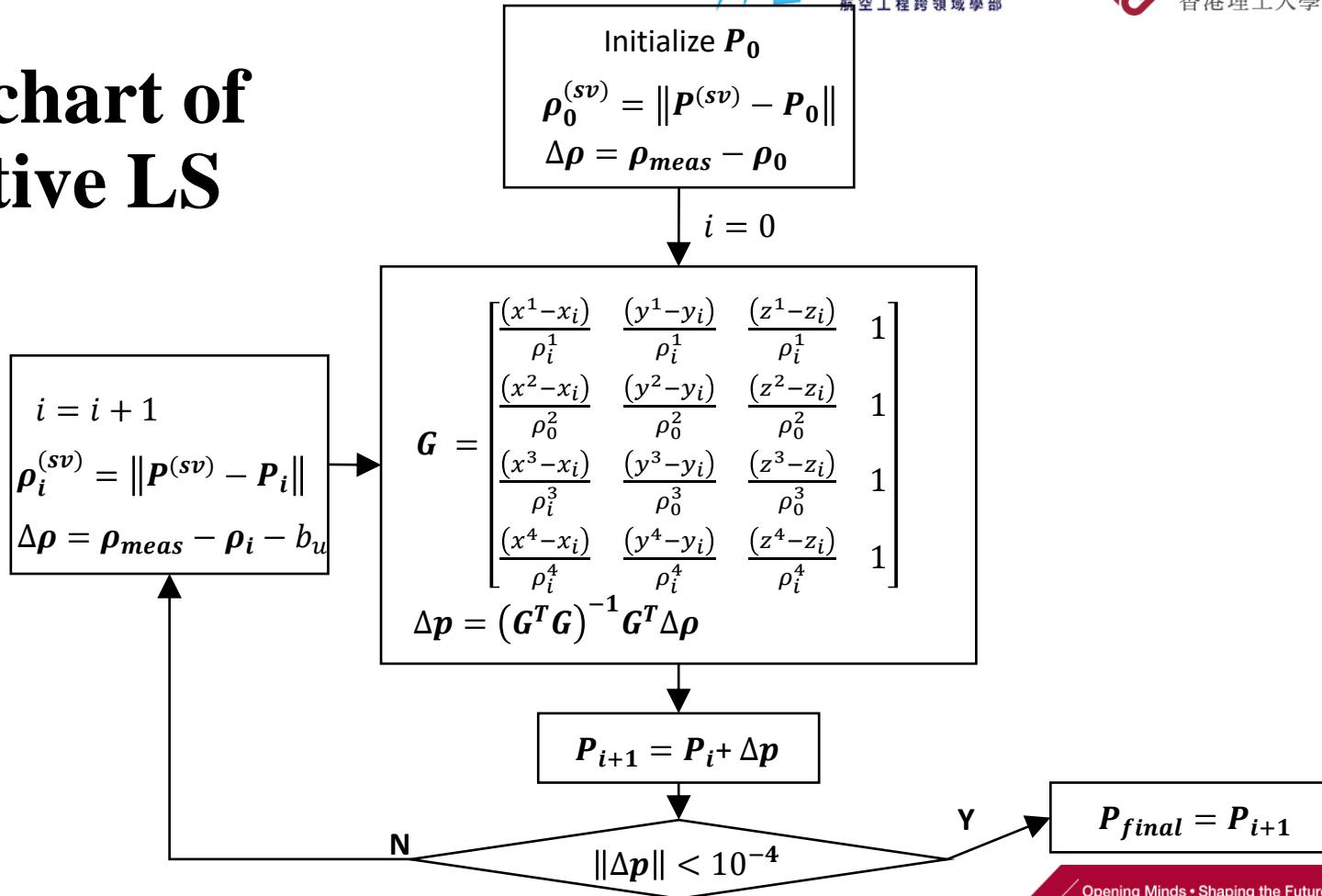
$$\Delta p = G^{-1} \Delta \rho \longrightarrow \Delta p = (G^T G)^{-1} G^T \Delta \rho$$

Satellite more than 4
then we need pseudo-inverse

$$P_1 = P_0 + \Delta p$$



Flowchart of Iterative LS





Example of Iterations in LS method

- > 4 unknown variables (x, y, z, clock) are present.
- > At least 4 visible satellites are required.
- > With true satellite positions and true range between satellites and user antenna, the calculated position is true (only one solution).
- > It is impossible in a practical sense.
- > Least-Square method (LS method) is mainly used for the estimation of user antenna position.



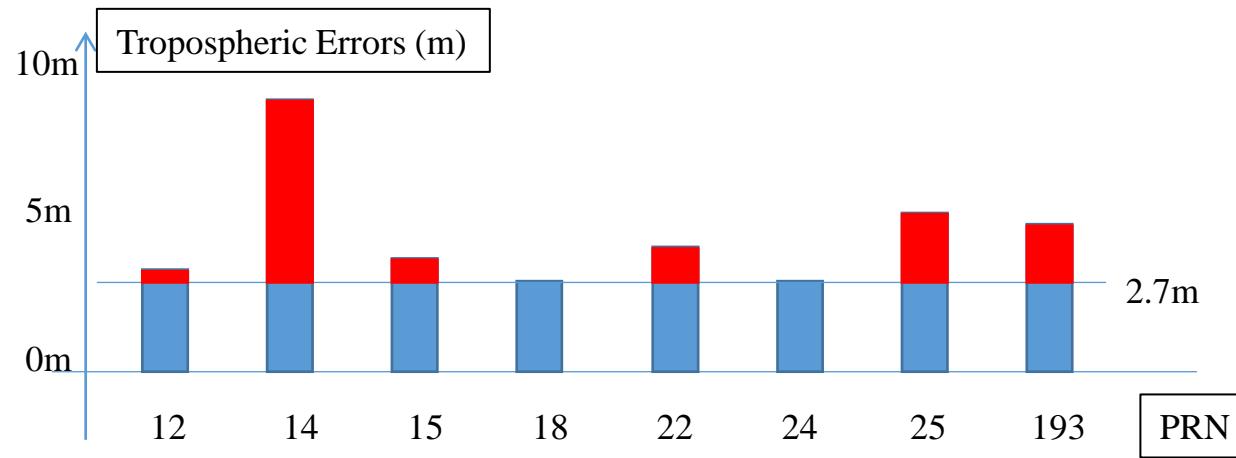
Example of Iterations in LS method

- > The user antenna was located in PolyU campus.
- > If we set (0, 0, 0) as an initial x, y, z positions,
- > After the first iteration, the estimated position was **22.156, 114.191, 1252955m.** (Po Toi Island)
- > Secondly, it was **22.304, 114.101, 42298m** (close to near sea of Kowloon)
- > Thirdly, it was **22.305166, 114.181192, 116m** (about 30m away from antenna)
- > Fourth, it was **22.305843, 114.181064, 63m** (within 2m from antenna)



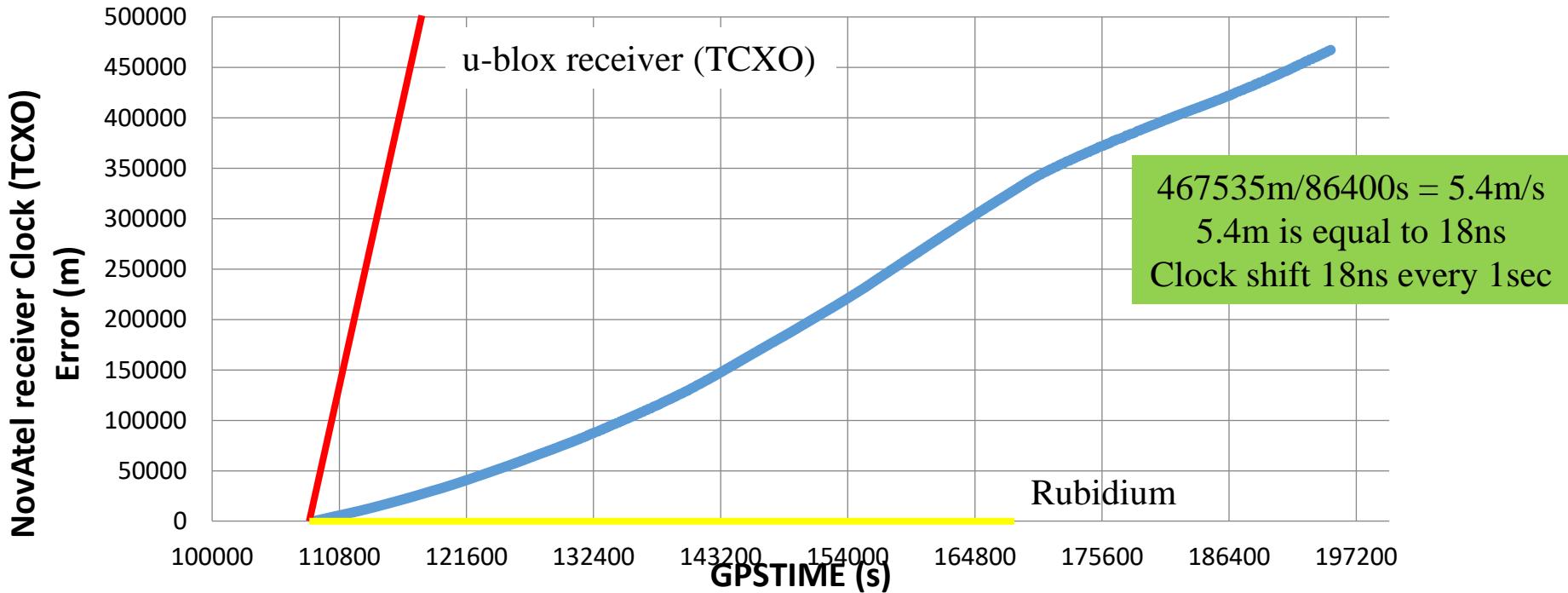
Common Biases are negligible

> Please remember that the common biases to all satellites are negligible in LS method. **They are absorbed into clock offset term.**



What is receiver clock offset ?

Receiver clock offset is co-product of single positioning





Doppler Effect



- > Receiver is set in the car.
- > Received frequency is
- > “ c_s ” is speed of light.
- > Doppler frequency “ f_D ” is equal to “ $f_{obs} - f_{source}$ ”
- > FLL (frequency lock loop) tries to estimate “ f_D ”.
- > Once we can estimate “ f_D ”, “ v_o ” can be resolved.

$$f_{obs} = f_s \frac{c_s - v_o}{c_s - v_s}$$

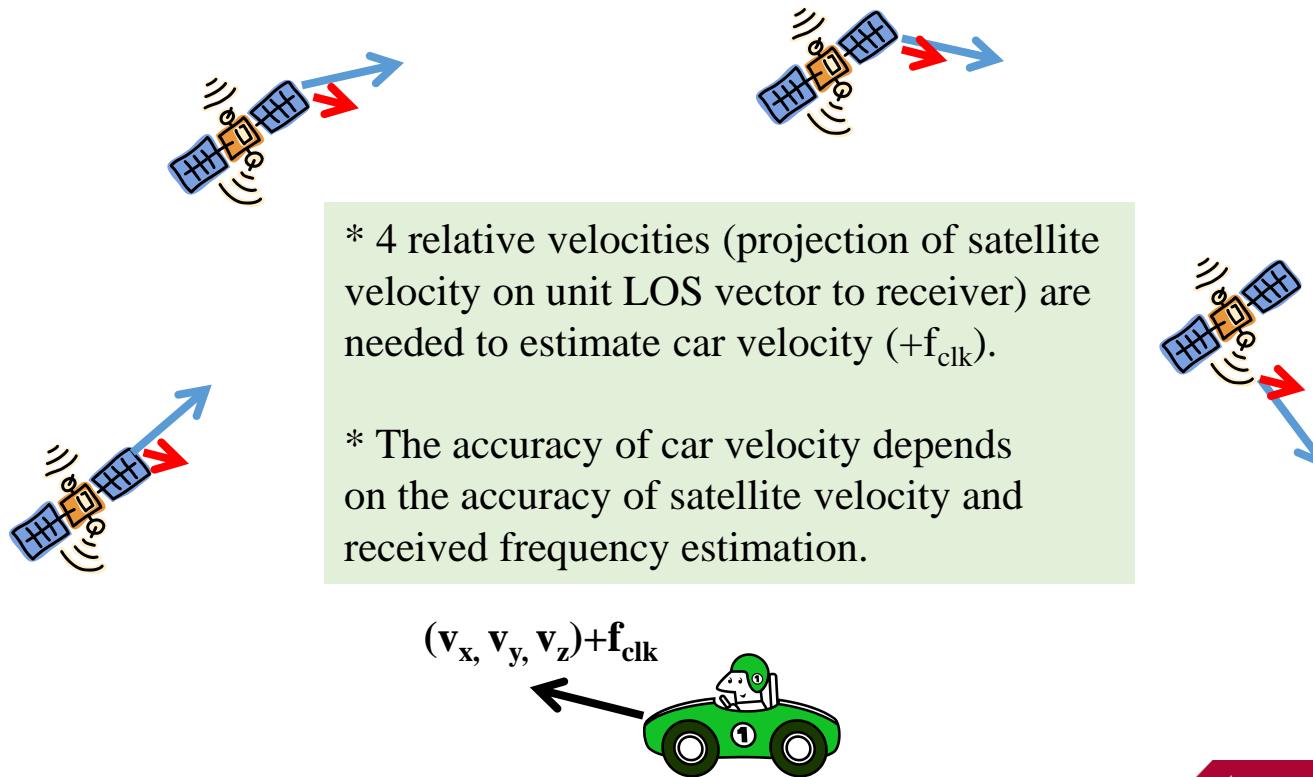


Velocity Estimation

- > Velocity estimation in GPS is just same as shown in the previous slide.
- > The differences are as follows.
 - * **3 dimension velocity (v_x, v_y, v_z) have to be estimated.**
 - * **Frequency in the receiver is based on on-board clock.**
 - * **Measurement is pseudorange rate, which calculated from Doppler frequency AND satellite velocity.**
- > 4 unknown variables (v_x, v_y, v_z, f_{clk}) have to be estimated using at least 4 visible satellites. DOP is also important.
- > Velocity estimation is same as position estimation.



Image of Velocity Estimation





Receiver Velocity Estimation from the Doppler Measurements

Measurements from Doppler

$$\mathbf{y} = (-\lambda_i D_{r,i}^1, -\lambda_i D_{r,i}^2, -\lambda_i D_{r,i}^3, \dots, -\lambda_i D_{r,i}^m)^T$$

Observation function

$$\mathbf{h}(\mathbf{x}) = \begin{pmatrix} r_r^1 + cdt_r - cd\dot{T}^1 \\ r_r^2 + cdt_r - cd\dot{T}^2 \\ r_r^3 + cdt_r - cd\dot{T}^3 \\ \vdots \\ r_r^m + cdt_r - cd\dot{T}^m \end{pmatrix} \quad \mathbf{H} = \begin{pmatrix} -\mathbf{e}_r^{1T} & 1 \\ -\mathbf{e}_r^{2T} & 1 \\ -\mathbf{e}_r^{3T} & 1 \\ \vdots & \vdots \\ -\mathbf{e}_r^{mT} & 1 \end{pmatrix} \quad (\text{F.6.28})$$

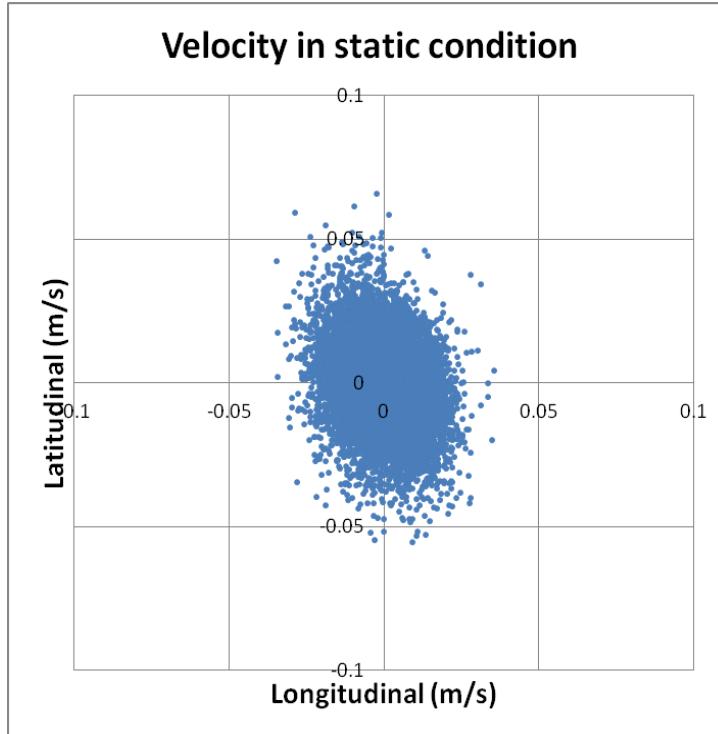
The range-rate r_r^s between the receiver and the satellite in these equations is derived from:

$$r_r^s = \mathbf{e}_r^{sT} \left(\mathbf{v}^s(t^s) - \mathbf{v}_r \right) + \frac{\sigma_e}{c} \left(v_y^s x_r + y^s v_{x,r} - v_x^s y_r - x^s v_{y,r} \right) \quad (\text{F.6.29})$$

Can you try to formulate the steps for GNSS velocity estimation similar to the position estimation? 😊



Performance of GPS based Velocity



$\text{std} = 1.6 \text{ cm/s}$

Accuracy in terms of frequency

GPS L1 wavelength = 19cm

1Hz : 19cm

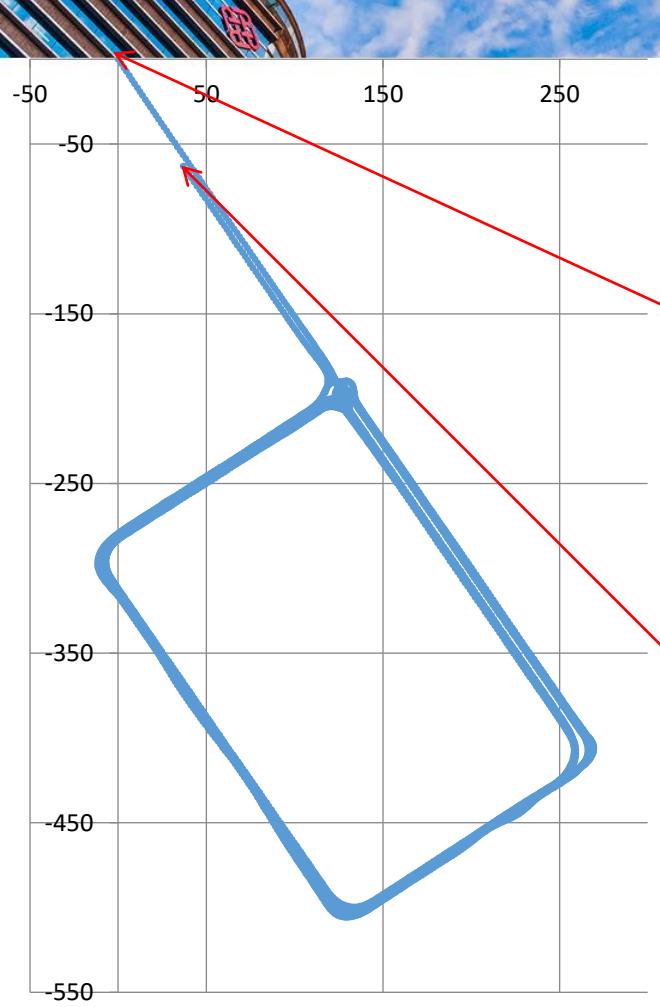
0.1Hz : 1.9cm

Accuracy in terms of satellite velocity

$\text{sv_vel [t]} = (\text{sv_vel [t+1]} - \text{sv_vel [t-1]})/2$

based on ephemeris parameters

Accuracy in velocity is very good
comparing to accuracy in positioning.



Moving Platform

(Sub-urban area)

- Origination : 0,0
- Velocity was accumulated.
- Data Rate : 5Hz
- Period : 650 sec
- Receiver : NovAtel OEM6
- Left and right rounds : 6 times
- End point : 36.76m,-62.91m
- RTK : 35.75m,-65.18m

Deviation after 11 minutes velocity accumulation was about 2-3 m.

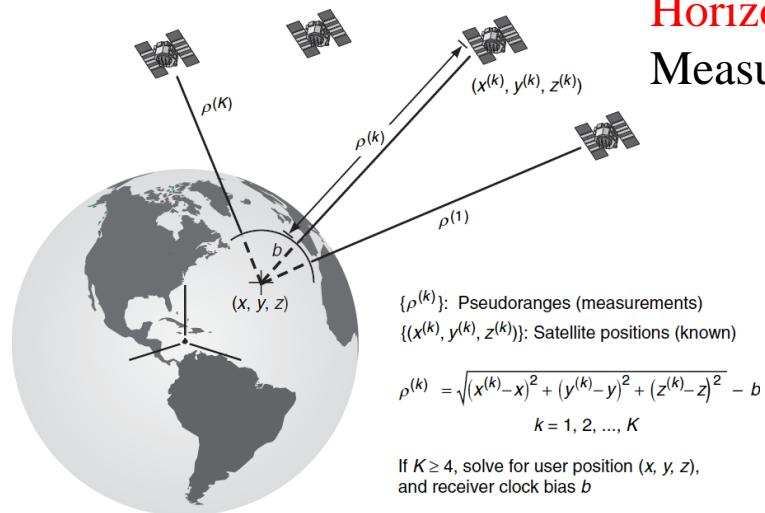


GPS Positioning Performance



Positioning Performance of GPS

Positioning Performance =
Measurements Accuracy × DOP



Horizontal accuracy =
Measurements accuracy × HDOP



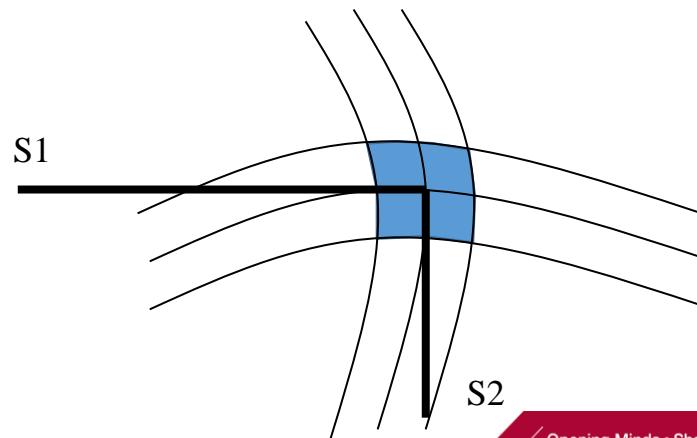
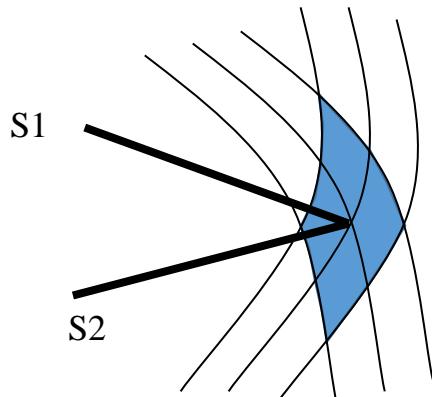
Satellite Geometry

- > Relative position between the user and the GPS satellites affects the accuracy of the solution
 - Geometric Dilution Of Precision GDOP
 - Position or spherical PDOP
 - Horizontal HDOP
 - Vertical VDOP
 - Time TDOP
- > Lower DOP values result in better accuracy



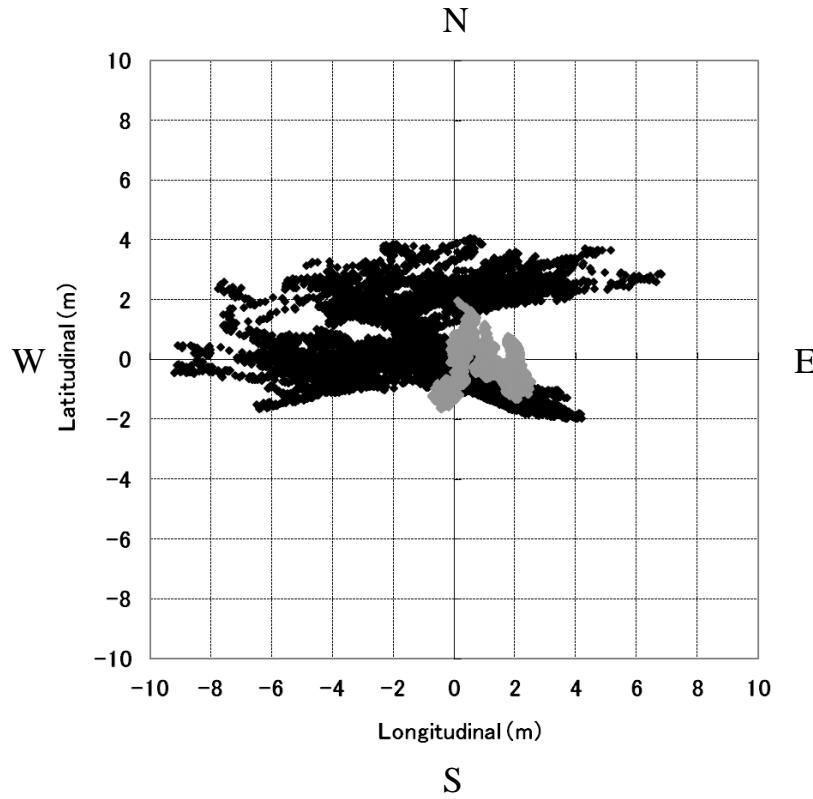
What is DOP ? (dilution of precision : DOP)

- If the measurements errors are zero, the calculated user position is true.
- However, if the measurements include some errors, the accuracy depends on measurement errors as well as the geometry of satellites (=DOP).





All Satellites VS. East Visible Satellites



- > Only east side satellites are used in the dark color plots.
(average=8.7)
- > All satellites are used in the light color plots.
(average=4.6)



Calculation of DOP

$$\Delta p = \boxed{(G^T G)^{-1} G^T \Delta \rho}$$

Mapping matrix from *pseudorange* domain to *positioning* domain

$$H = (G^T G)^{-1}$$

$$H = \begin{bmatrix} H_{11} & & & H_{ij} \\ & H_{22} & & \\ & & H_{33} & \\ H_{ii} & & & H_{44} \end{bmatrix}$$

$$\text{Position DOP (PDOP)} = \sqrt{H_{11} + H_{22} + H_{33}}$$

$$\text{Geometry DOP (GDOP)} = \sqrt{H_{11} + H_{22} + H_{33} + H_{44}}$$

$$HDOP = \sqrt{H_{11} + H_{22}}$$

$$VDOP = \sqrt{H_{33}}$$

$$TDOP = \sqrt{H_{44}}$$

$$\sigma_e^2 = \sigma_{URE}^2 H_{11}$$

$$\sigma_n^2 = \sigma_{URE}^2 H_{22}$$

$$\sigma_u^2 = \sigma_{URE}^2 H_{33}$$

$$\sigma_b^2 = \sigma_{URE}^2 H_{44}$$

$$PDOP \approx 1.5 \sim 5.0$$

$$HDOP \approx 0.5 \sim 1.5$$

$$VDOP \approx 1.0 \sim 4.5 \text{ (Why worse?)}$$



Why we learn measurements and errors ?

- > Needless to say, “position, velocity and time” are important for users.
- > The ability to improve final performance of the above outputs **strongly depends on how can we estimate or possibly mitigate** measurements errors.
- > Measurements errors strongly depends on the **environment and receiver performance**.



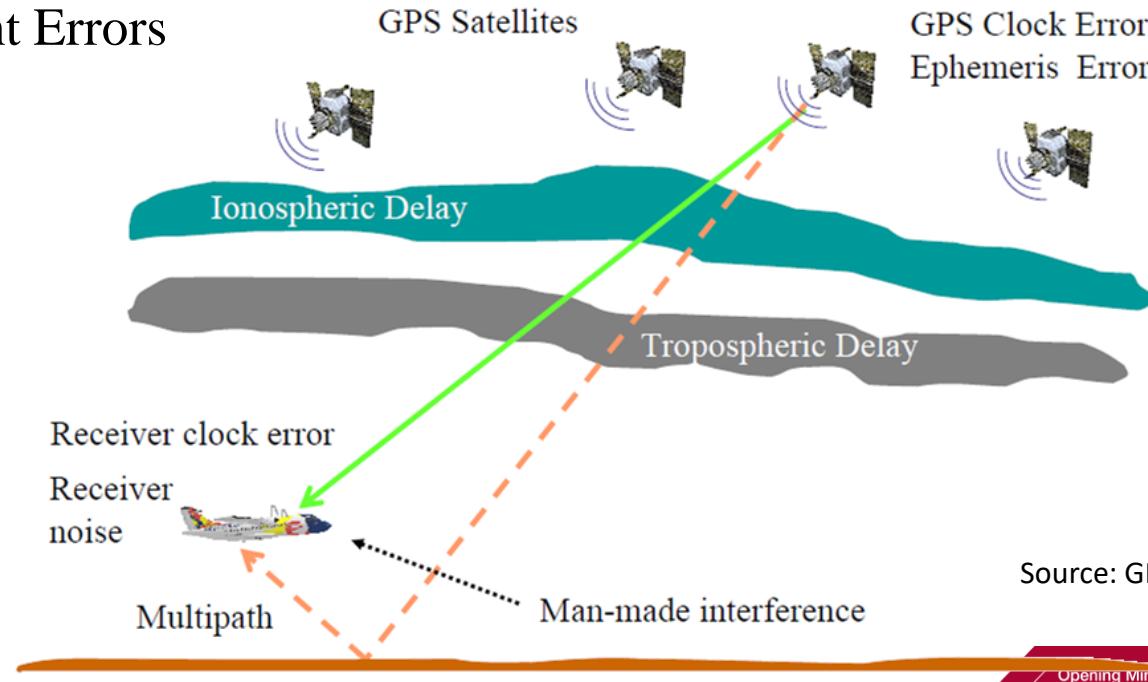
Noise and Bias

- Errors are often categorized as noise and bias.
 - > #1 Errors in the parameter values broadcast by a satellite in its navigation message for which the **Control Segment** is responsible
 - > #2 Uncertainties associated with the **propagation medium** which affect the travel time of the signal from a satellite to the receiver
 - > #3 **Receiver noise** which affects the precision of a measurement, and **interference** from signals reflected from surfaces in the vicinity of the antenna



Source of Measurements Errors

- > Control Segment Errors
- > Signal Propagation Modeling Errors
- > Measurement Errors



Source: GPS Lab. Stanford Univ.



Typical pseudo-range measurement errors for L1 receiver

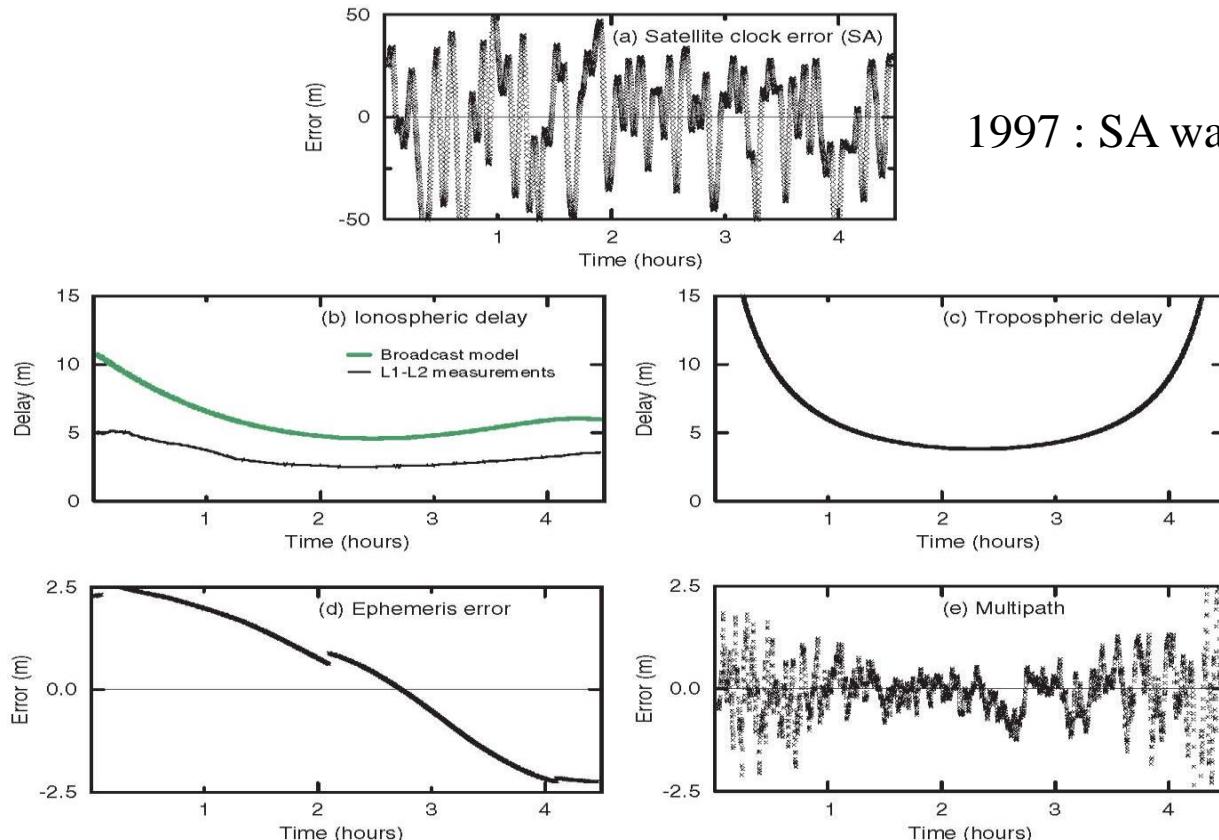
Error Source	RMS Range Error
Satellite clock and ephemeris parameters	3 m (SIS URE)
Atmospheric propagation modeling	5 m
Receiver noise and multipath	1 m
User range error (URE)	6 m

Total RMS Range Error = SIS+ URE

URE : User Range Error
SIS : Signal-in-Space



Measurement Error : Empirical Data

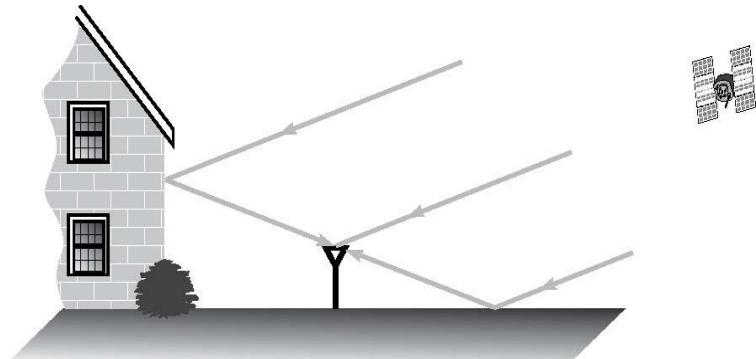


1997 : SA was activated.

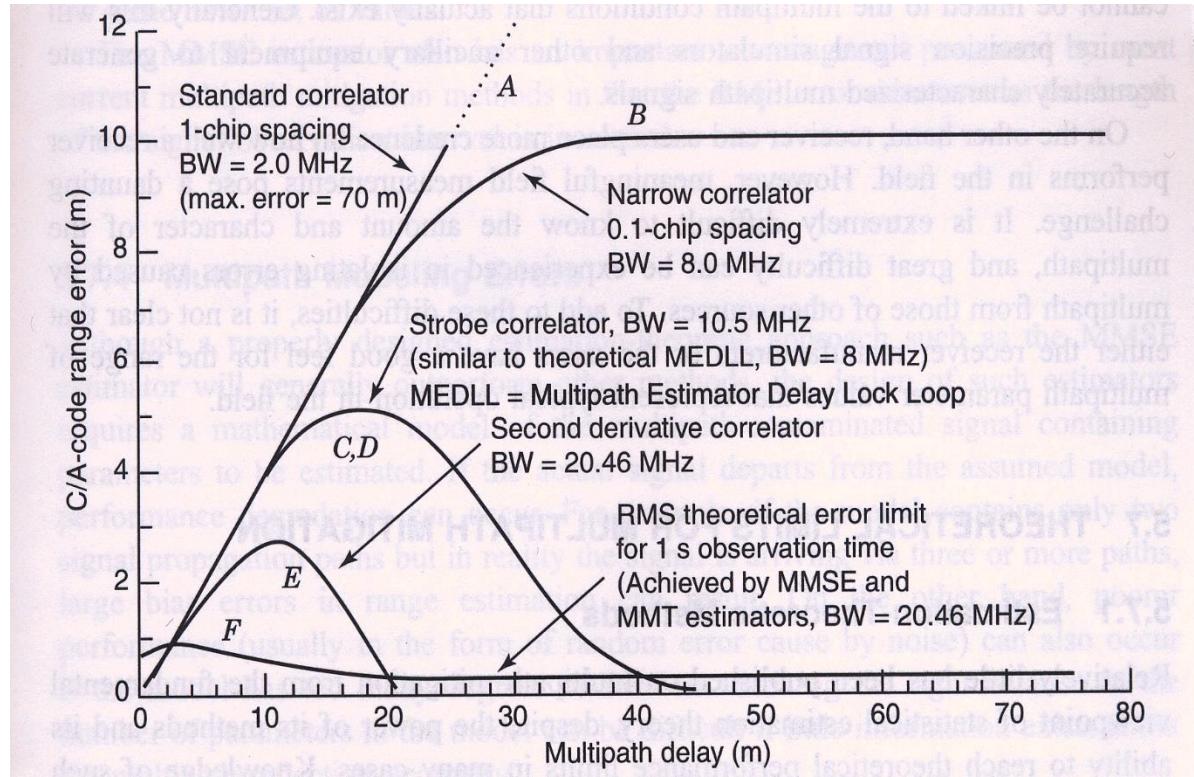


Measurement Errors - Multipath

- Multipath refers to the phenomenon of a signal reaching an antenna via two or more paths.
- The range measurement error due to multipath depends on the **strength** of the reflected signal and the **delay** between direct and reflected signals.
- Mitigation of multipath errors : **Antenna or Receiver**

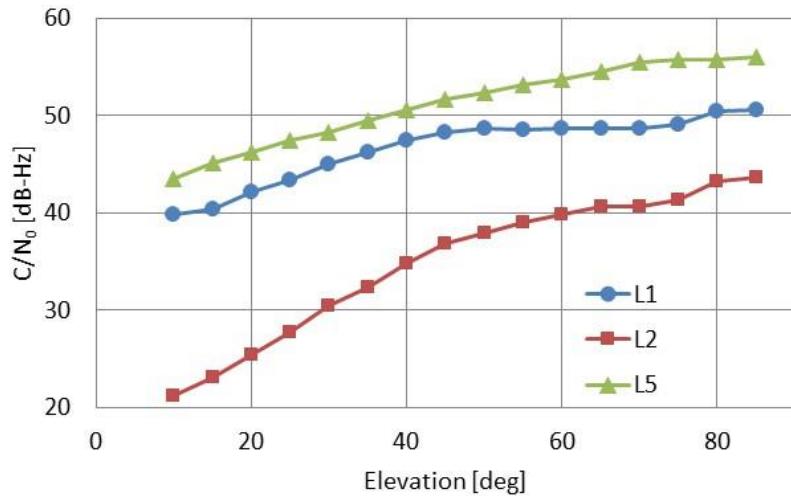
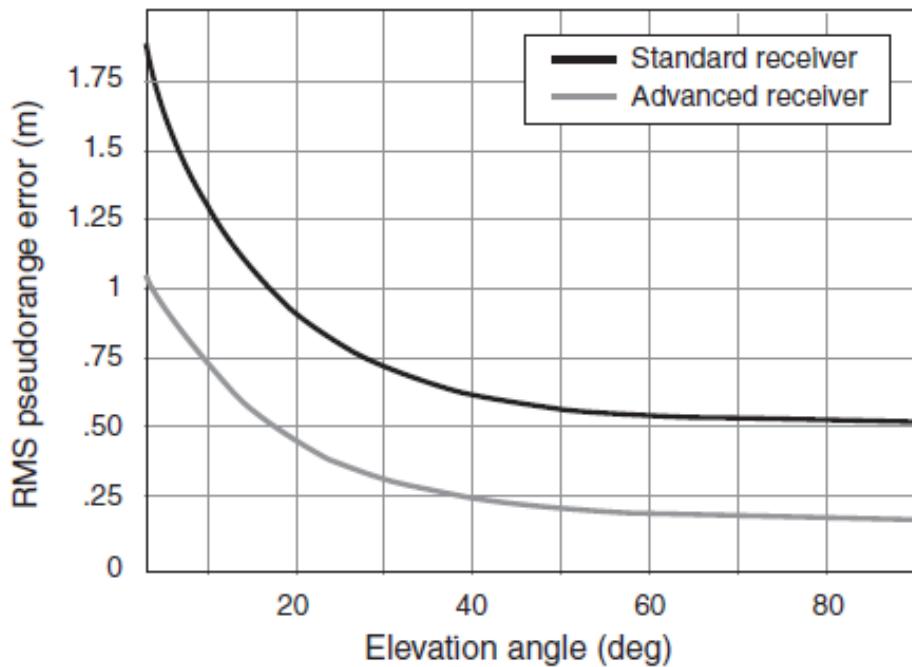


Multipath Mitigation Technique (Receiver inside)





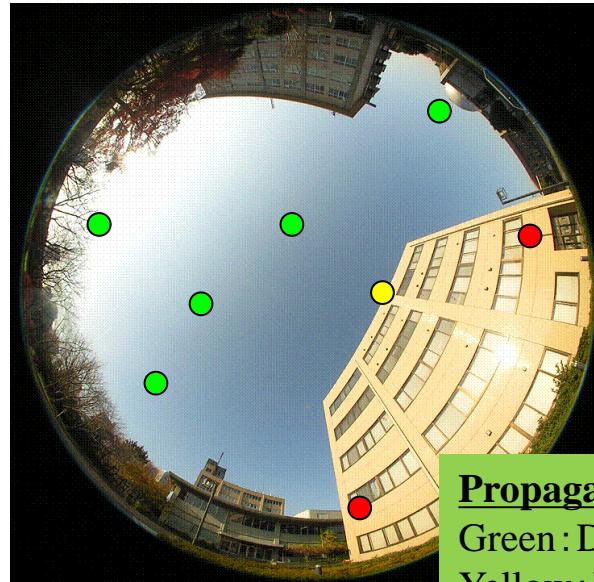
Receiver thermal noise for two types of receiver



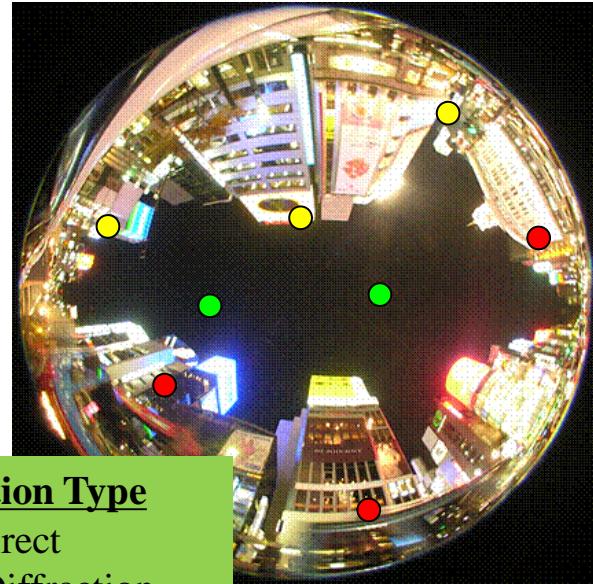
Received Signal Strength (C/N_0)
and Elevation



Sky Views in two different places (same constellation but different performance)



Campus



Urban Canyon

Propagation Type

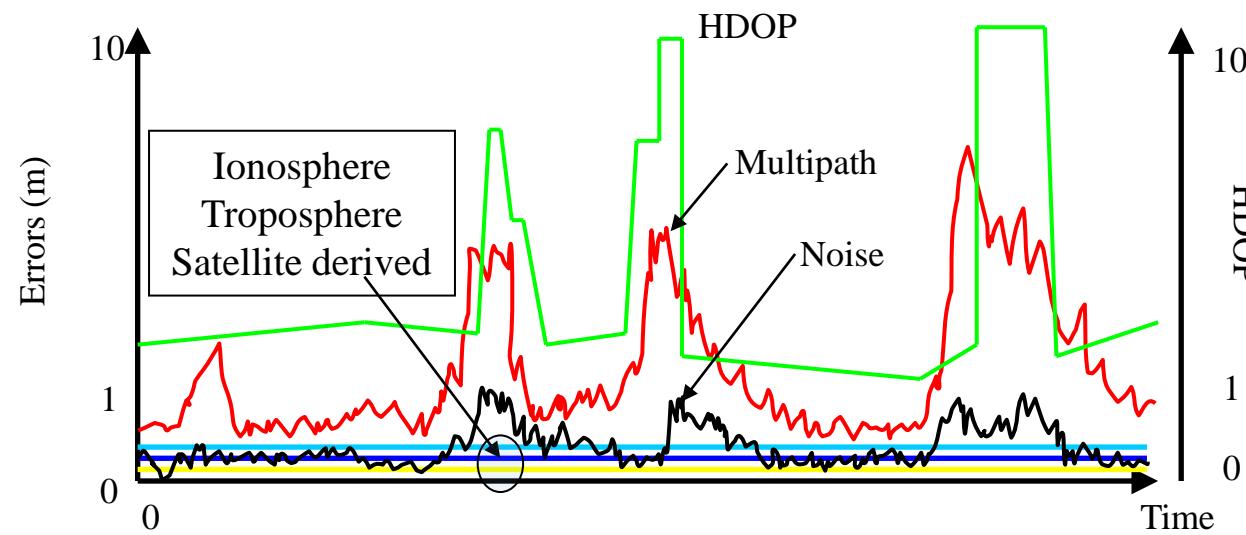
Green : Direct

Yellow : Diffraction

Red: Masking
+Reflection



Temporal Measurements Errors and DOP Variation (sub-urban)



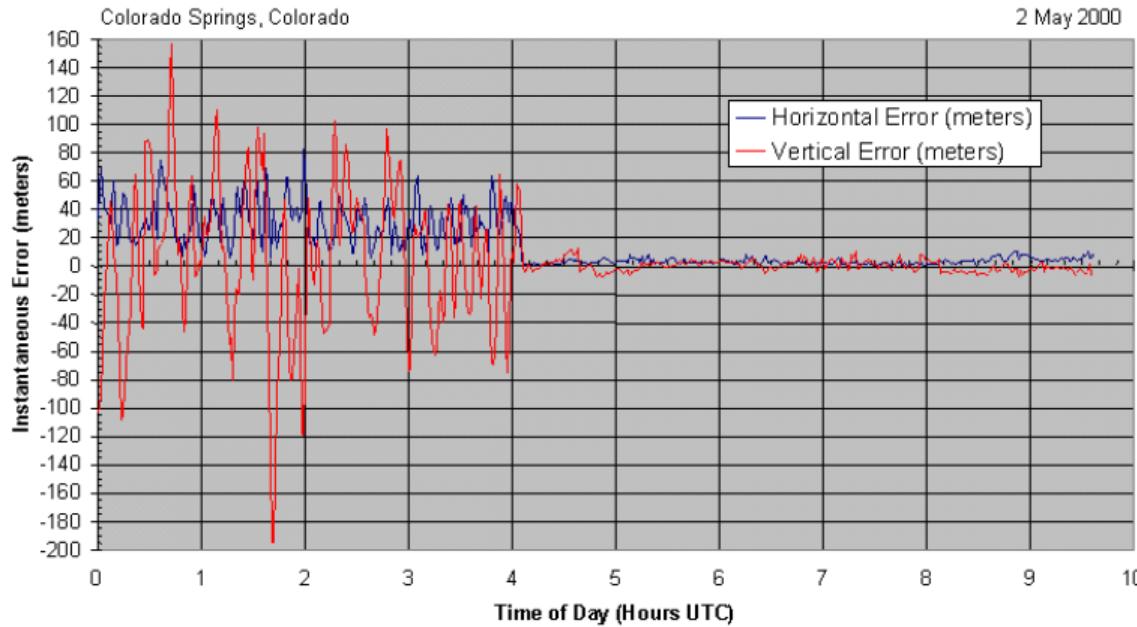


GPS Measurement Errors

Source	Potential error size	Error mitigation using single point positioning
Satellite clock model	2 m (rms)	→
Satellite ephemeris prediction	2 m (rms) along the LOS	→
Ionospheric delay	2-10 m (zenith) Obliquity factor 3 at 5°	1-5 m (single-freq.) within 0.5m (dual-freq.)
Tropospheric delay	2.3-2.5m (zenith) Obliquity factor 10 at 5°	0.1-1 m
Multipath (open sky)	Code : 0.5-1 m Carrier : 0.5-1 cm	→
Receiver Noise	Code : 0.25-0.5 m (rms) Carrier : 1-2 mm (rms)	→



History...Deactivation the artificial distortion of the signal



On September 18, 2007, the US DoD reported that with the next generation of GPS satellites (GPS III), satellite navigation signals can no longer be artificially distorted



Improved Positioning



Why we discuss about measurement errors ?

- > Back to bias and noise errors discussion, noise errors of pseudo-range can be mitigated to some degree using **carrier phase smoothing technique**.
- > On the other hand, you have to estimate **bias errors** as accurate as possible **by yourself** to improve positioning performance.
- > All kinds of improved techniques are essentially same in terms of estimating or eliminating bias or noise errors.



Improved GPS

- > Positioning Smoothing by Carrier measurement
- > **DGPS** (Differential GPS) and RTK (Real Time Kinematic) are powerful method for error mitigation.
- > DGPS uses the fact that the **most of error sources change slowly** in the time domain if the distance between reference and user is approx. within 100km.



Carrier Phase Measurement

$$\phi(t) = \phi_u(t) - \phi^s(t - \tau) + N$$

$$\phi(t) = f \cdot \tau + N$$

$$= \frac{r(t, t - \tau)}{\lambda} + N$$

$\phi_u(t)$ carrier phase in the receiver

$\phi^s(t - \tau)$ carrier phase in the satellite

τ transit time

N integer ambiguity

f, λ Doppler frequency and wavelength

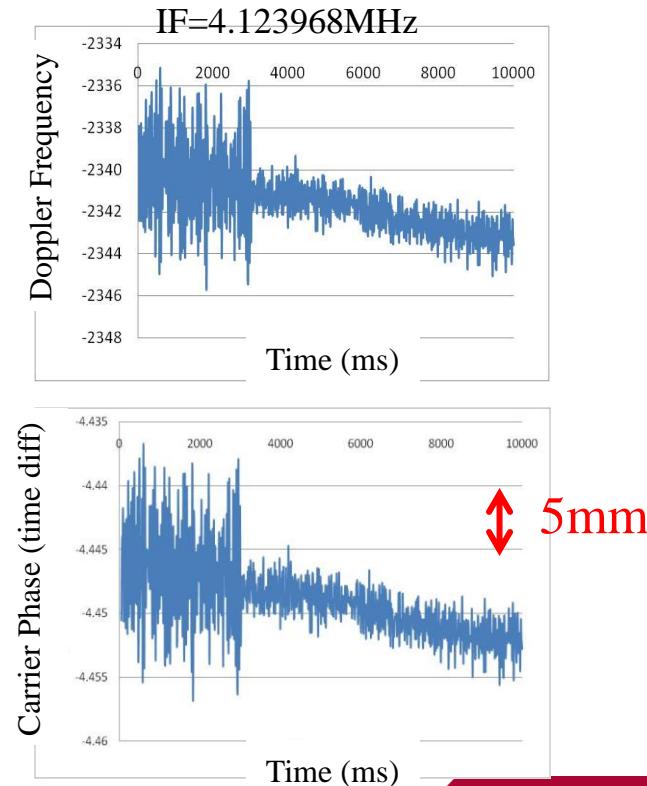
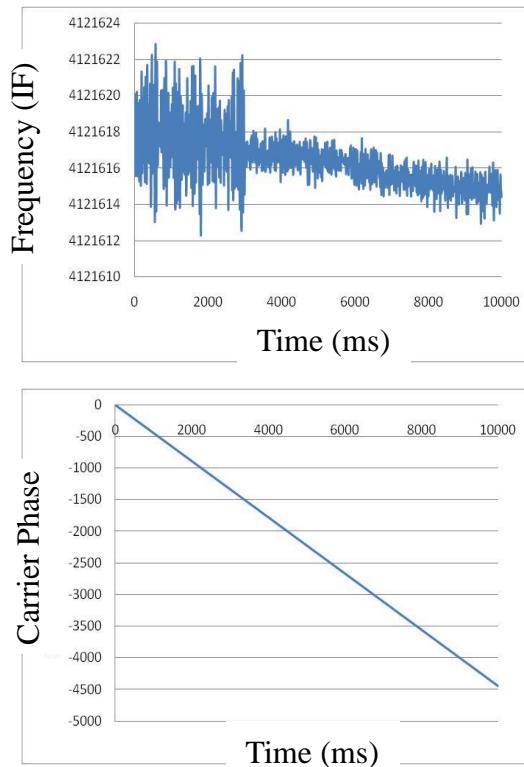
$r(t, t - \tau)$ geometrical range

Clock error and measurements errors are assumed zero.

**Carrier phase measurement is accumulated Doppler frequency.
Be careful about “f”. In the receiver, carrier frequency is basically converted to “IF”.**



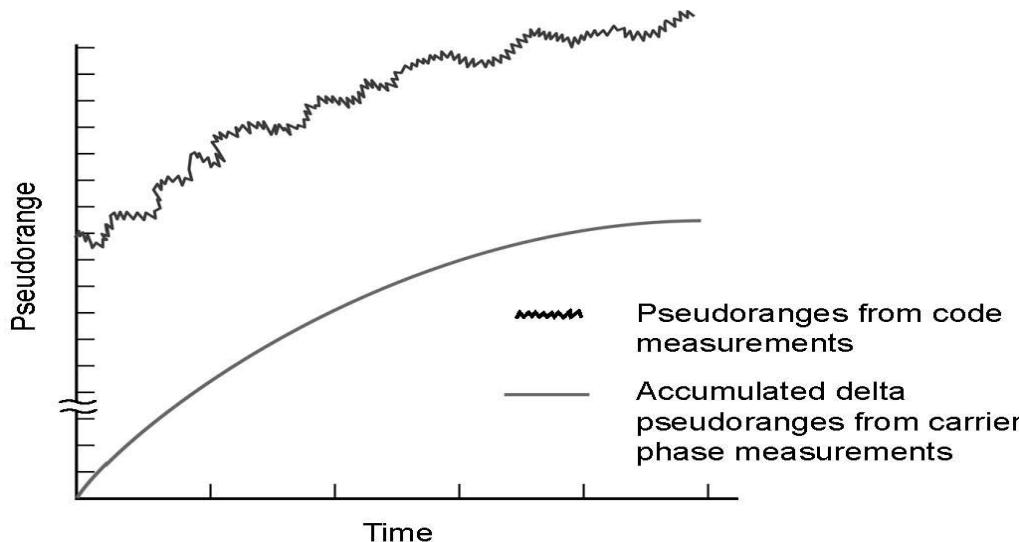
Real Carrier Phase Measurements





Combining Code and Carrier Measurements

Carrier phase measurement can be used to smooth pseudo-range Measurement.



The code-based measurements are noisy. The carrier-based estimates are precise but ambiguous, and the plot starts arbitrarily at zero value.



Formula of Carrier Smoothing

$$\rho^*(t) = d^{(k)}_u(t) + b^{(k)}_u(t) - B^{(k)}(t) + T(t)$$

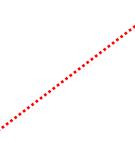
$$\phi(t_i) = \rho^*(t_i) - I(t_i) + N\lambda$$

$$\phi(t_{i-1}) = \rho^*(t_{i-1}) - I(t_{i-1}) + N\lambda$$

$$\Rightarrow \rho^*(t_i) = \phi(t_i) - \phi(t_{i-1}) + \rho^*(t_{i-1})$$

$$\overline{\rho(t_1)} = \rho(t_1)$$

$$\overline{\rho(t_{i+1})} = \frac{1}{M} \rho(t_{i+1}) + \frac{M-1}{M} \left[\overline{\rho(t_i)} + [\phi(t_{i+1}) - \phi(t_i)] \right]$$

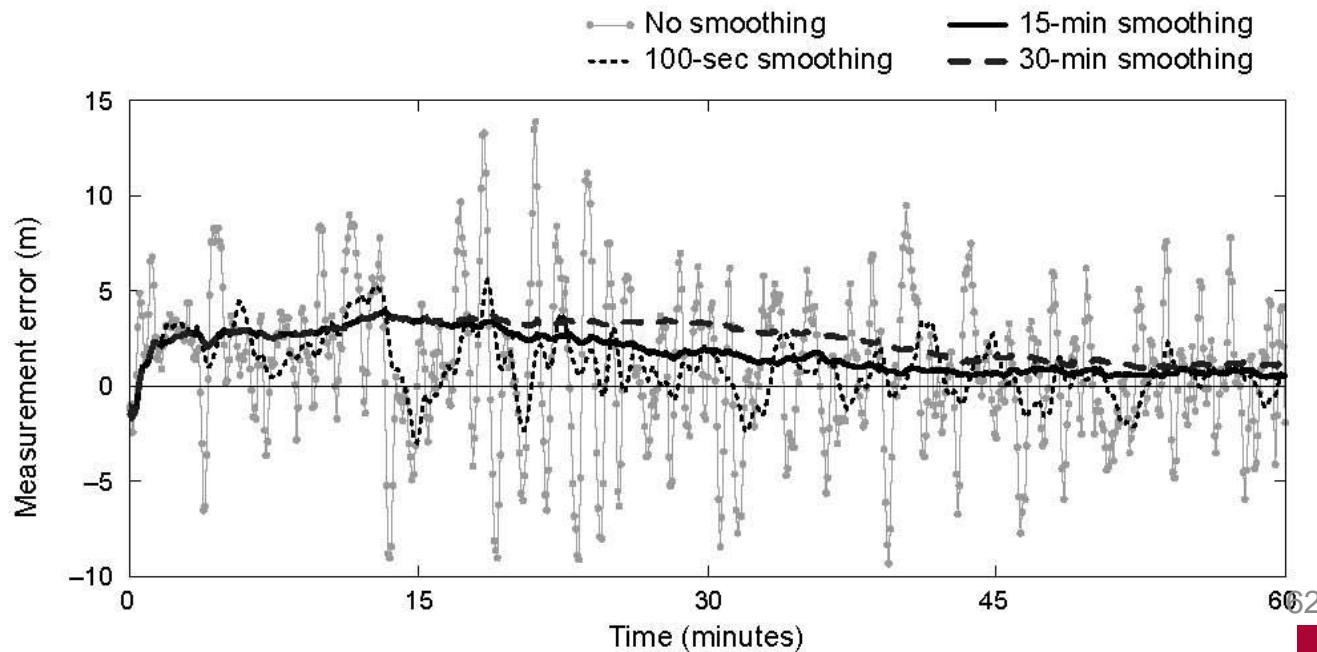


$$\left(\text{cycles} + \frac{\text{phase}}{2048} \right) \times \lambda_{L1}$$

Carrier-smoothed pseudo-ranges with different filter lengths

$$\bar{p}(t_i) = \frac{1}{M} p(t_i) + \frac{(M-1)}{M} [\bar{p}(t_{i-1}) + (\Phi(t_i) - \Phi(t_{i-1}))],$$

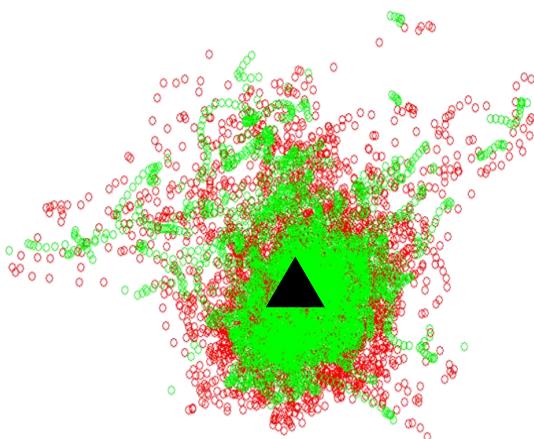
$$\bar{p}(t_1) = p(t_1).$$



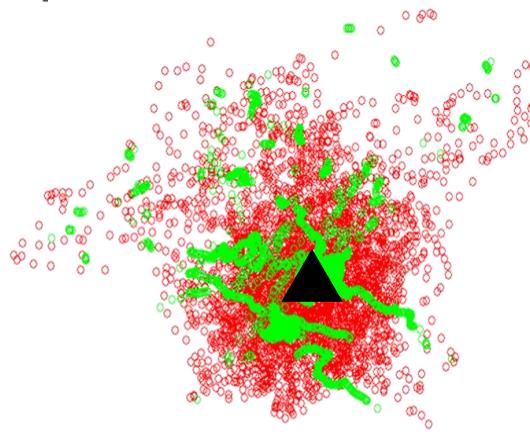


Carrier Smoothing Result using different M values

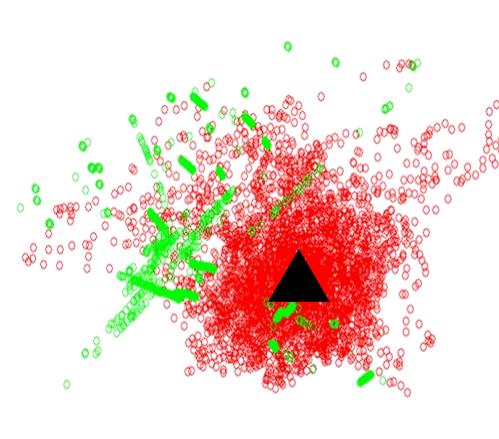
• M=10



■ M=100



■ M=5000

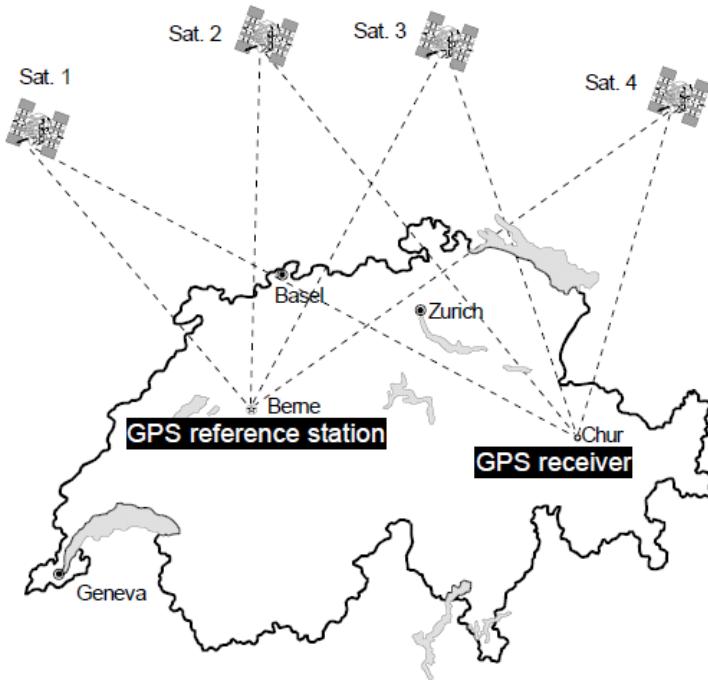


- Single point positioning
- Single point positioning with Carrier smoothing

▲ True position



Architecture of DGPS

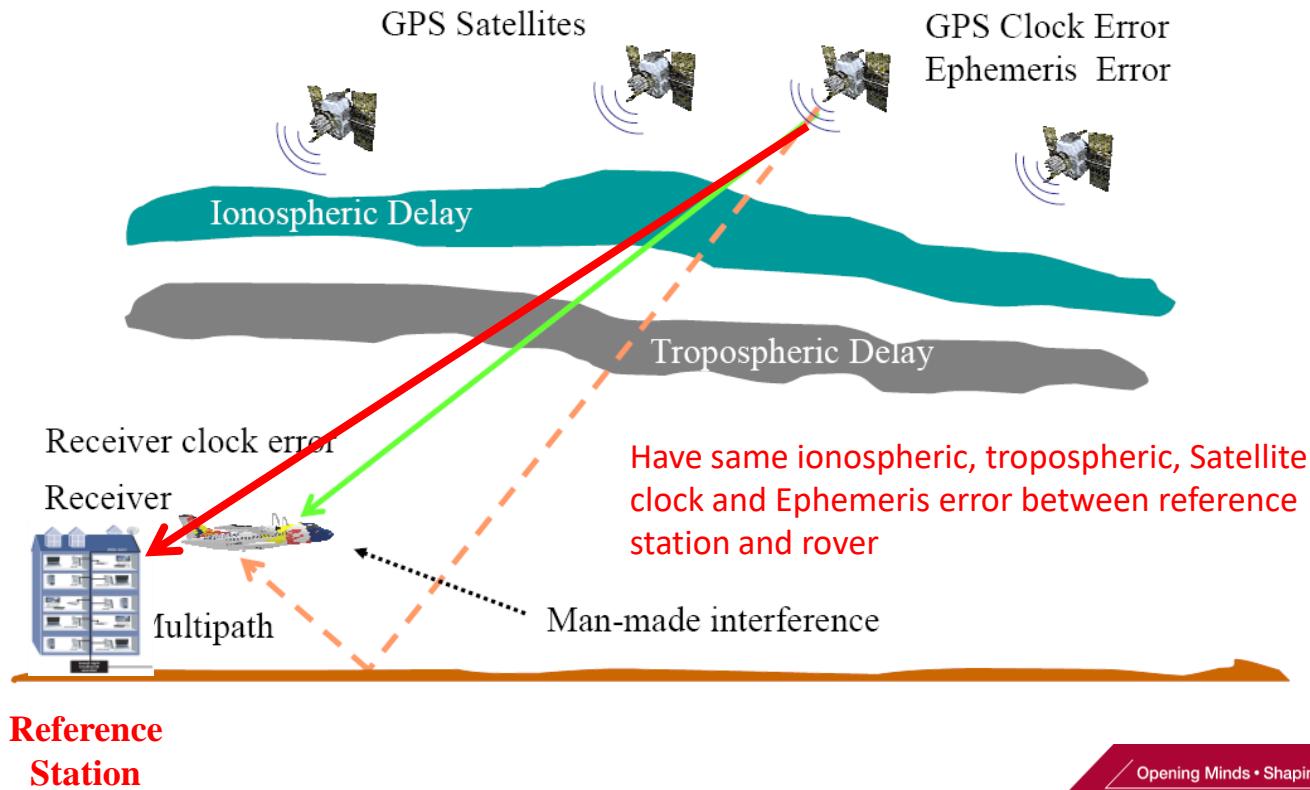


- Determination of the correction values at the reference station
- **Transmission of the correction values** from the reference station to the GPS user
- **Compensation** for the determined pseudo-ranges to correct the calculated position of the GPS user

$$\text{Correction [prn]} = \text{Pseudo-range[prn]} - \text{True-range [prn]}$$



Principle of DGPS



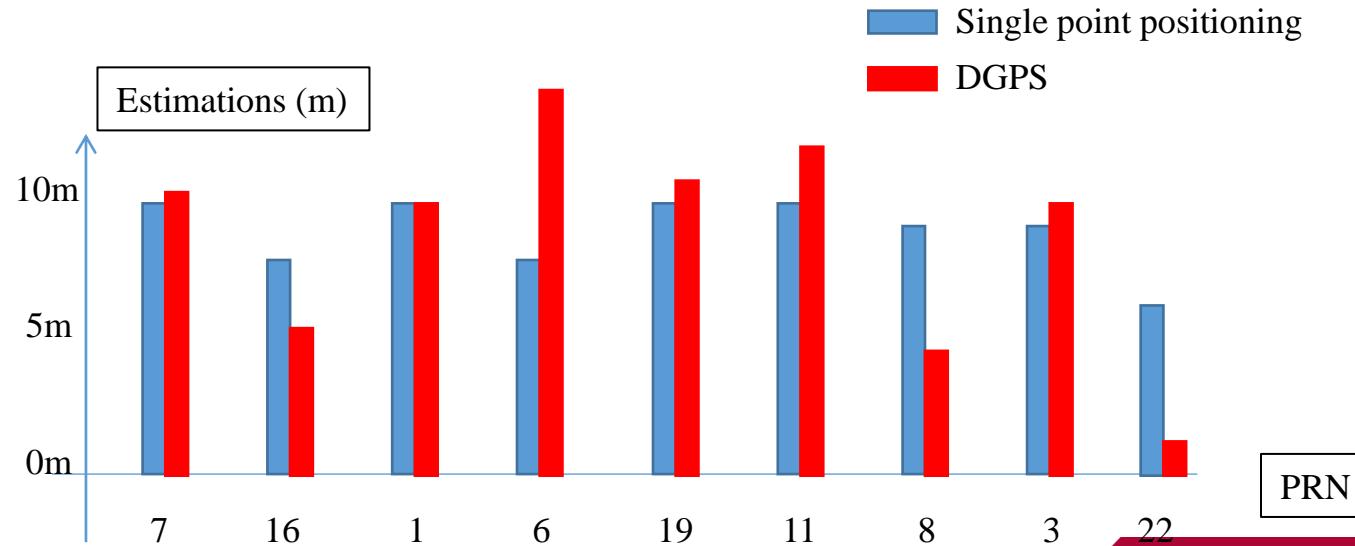


Real Correction Data

> Correction [prn] =

$$\text{Pseudo-range[prn]} - \text{True-range [prn]}$$

> Correction data provides the **better estimations in each satellite in LS method.**



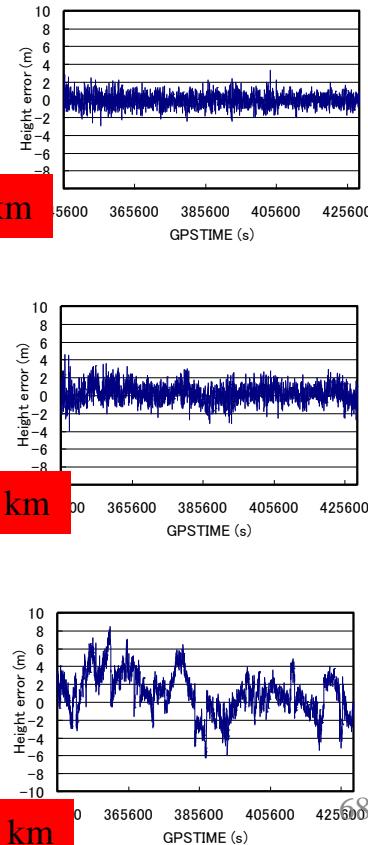
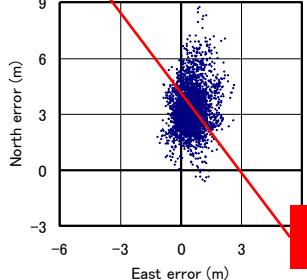
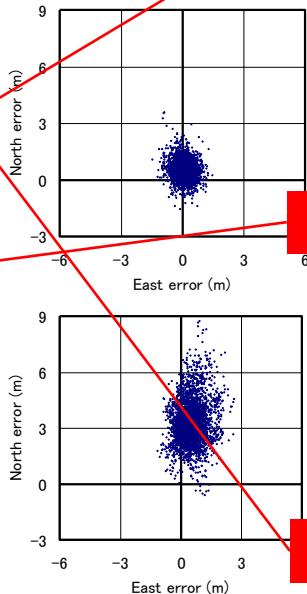
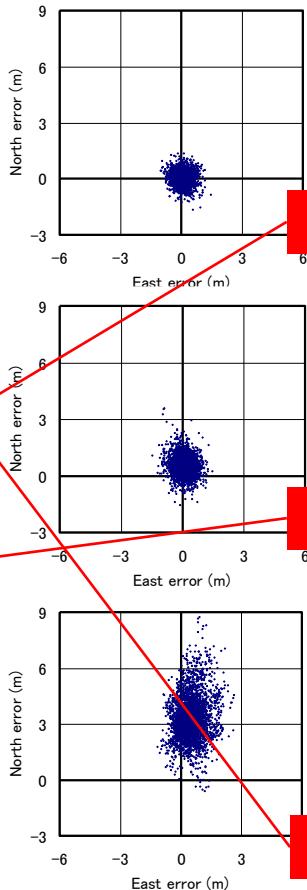
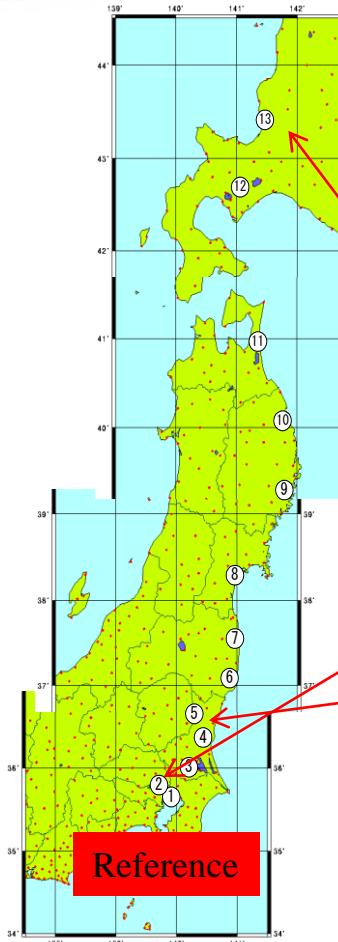


DGPS mitigates ...

Source	Potential error using SPP	Error mitigation using DGPS
Satellite clock model	2 m (rms)	0.0 m
Satellite ephemeris prediction	2 m (rms) along the LOS	0.1 m (rms)
Ionospheric delay	2-10 m (zenith) Obliquity factor 3 at 5°	0.2 m (rms)
Tropospheric delay	2.3-2.5m (zenith) Obliquity factor 10 at 5°	0.2 m (rms) + altitude effect
Multipath (open sky)	Code : 0.5-1 m Carrier : 0.5-1 cm	Not helpful
Receiver Noise	Code : 0.25-0.5 m (rms) Carrier : 1-2 mm (rms)	Not helpful

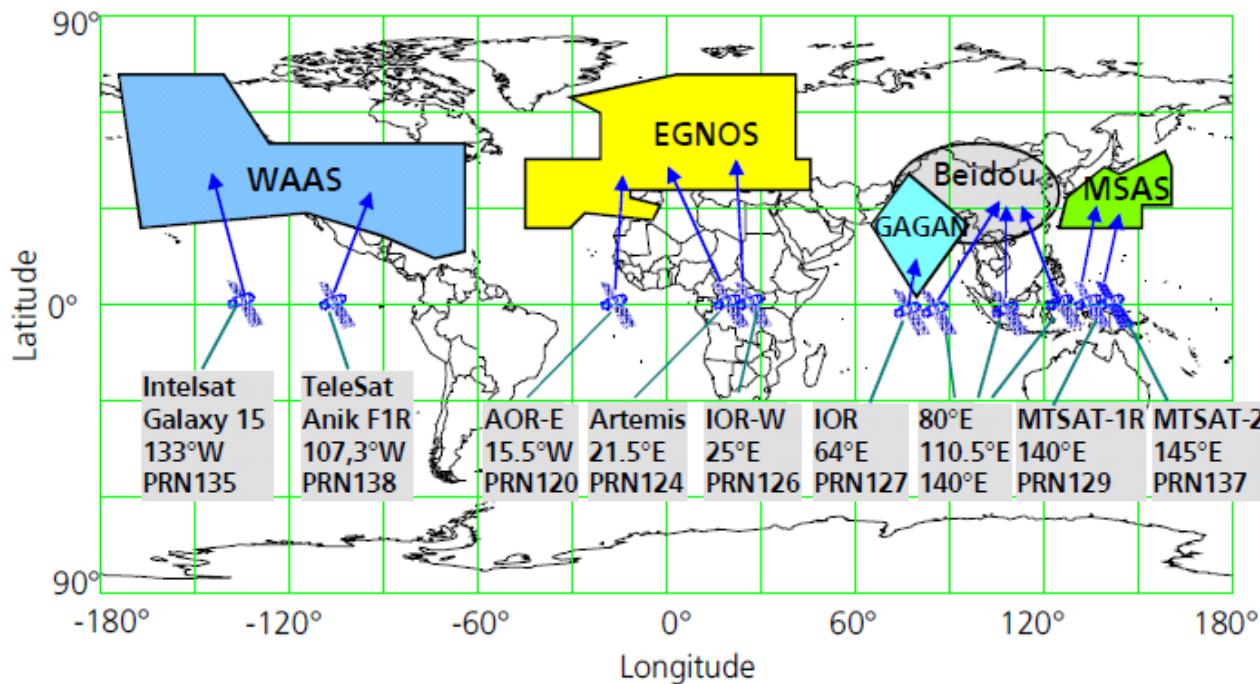
rms: root mean square

Limitation of DGPS





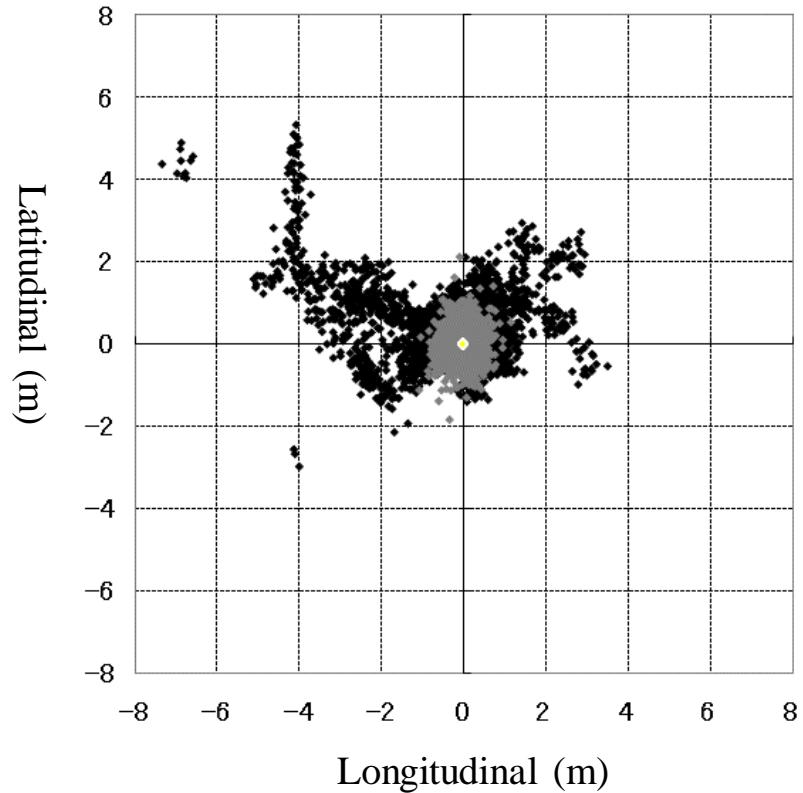
SBAS



Without the installation of the reference stations, you can use correction data through the SBAS satellite such as MTSAT in Japan. Under quiet ionospheric condition, the performance is generally good within 1-2 m .



DGPS and RTK Performance



- Single Positioning
- DGPS
- RTK

Rooftop (Lab.)
15s interval
24 hours
Reference : Ichikawa

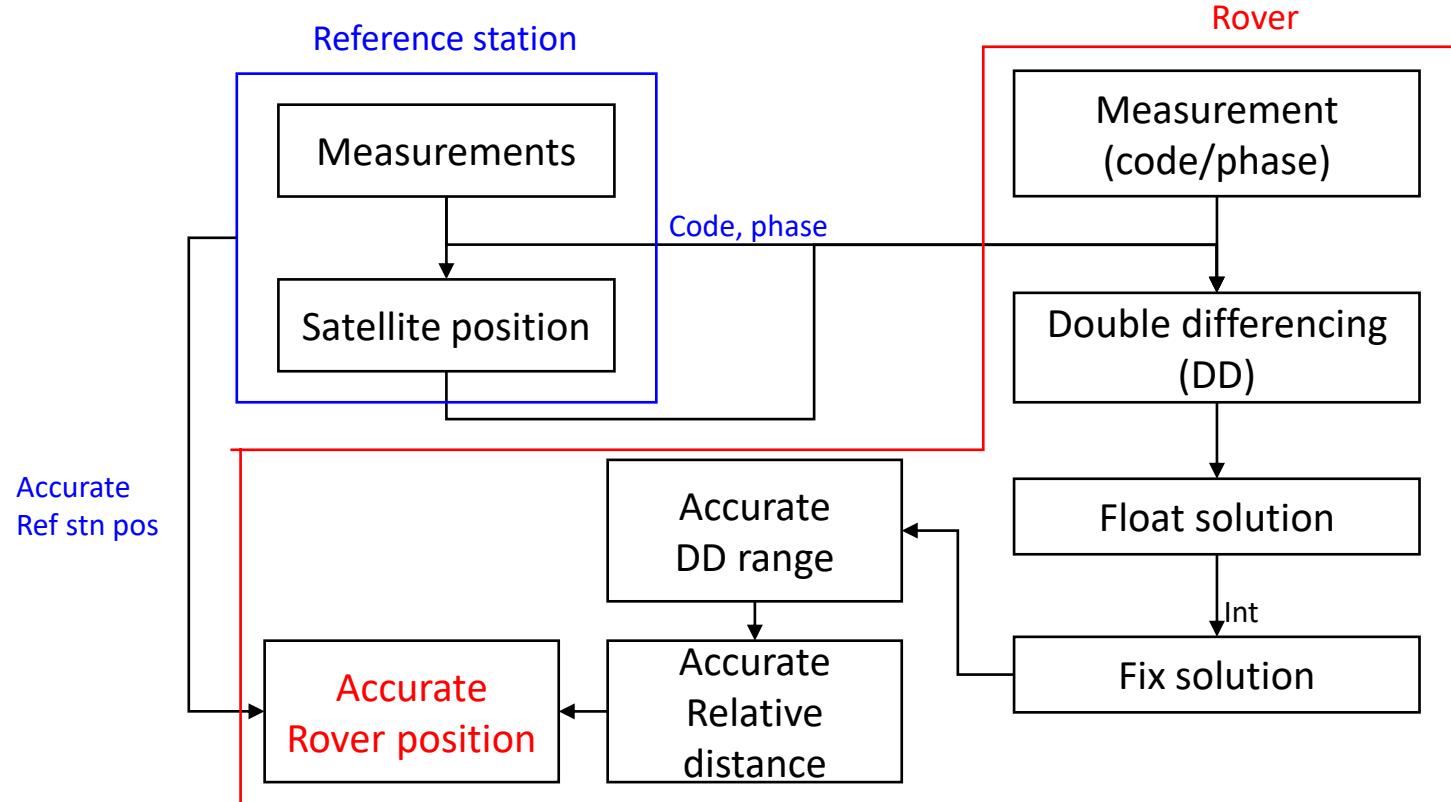


RTK (Real Time Kinematic)

- The concept of **RTK** is same as **DGPS**.
- RTK uses **carrier phase measurements**. DGPS uses pseudo-range measurements.
- GPS receiver is able to measure 1/100 of wavelength of L1 frequency (19 cm).
- If you have high-end receiver, you know your position **within 1-2cm accuracy** as long as you have 5 or more LOS satellites.



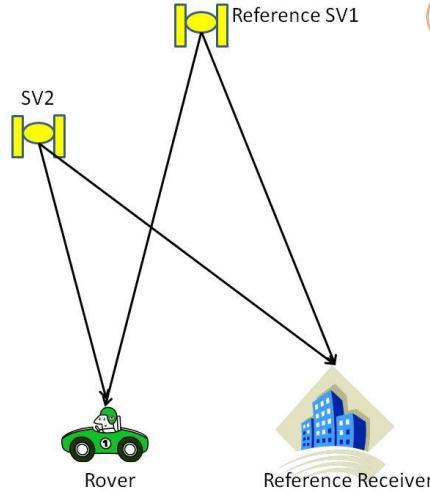
RTK Flowchart





Key Concept of RTK

(double difference technique)



$$\begin{aligned} P_{rov_ref}^{sv1_sv2} &= (P_{rov}^{sv1} - P_{ref}^{sv1}) - (P_{rov}^{sv2} - P_{ref}^{sv2}) \\ &= \rho_{rov}^{sv1} + c(dt_{sv1} - dT_{rov}) + ion_{rov}^{sv1} + tropo_{rov}^{sv1} + mp_{rov}^{sv1} + noise_{rov}^{sv1} \\ &\quad - [\cancel{\rho_{ref}^{sv1} + c(dt_{sv1} - dT_{ref}) + ion_{ref}^{sv1} + tropo_{ref}^{sv1} + mp_{ref}^{sv1} + noise_{ref}^{sv1}}] \\ &\quad - [\cancel{\rho_{rov}^{sv2} + c(dt_{sv2} - dT_{rov}) + ion_{rov}^{sv2} + tropo_{rov}^{sv2} + mp_{rov}^{sv2} + noise_{rov}^{sv2}}] \\ &\quad + [\cancel{\rho_{ref}^{sv2} + c(dt_{sv2} - dT_{ref}) + ion_{ref}^{sv2} + tropo_{ref}^{sv2} + mp_{ref}^{sv2} + noise_{ref}^{sv2}}] \\ &= \rho_{rov}^{sv1} - \rho_{ref}^{sv1} + \rho_{rov}^{sv2} - \rho_{ref}^{sv2} \quad \text{Completely zero assumed zero within 10 km} \\ &\quad + (mp_{rov}^{sv1} + noise_{rov}^{sv1}) - (mp_{ref}^{sv1} + noise_{ref}^{sv1}) \\ &\quad - (mp_{rov}^{sv2} + noise_{rov}^{sv2}) + (mp_{ref}^{sv2} + noise_{ref}^{sv2}) \end{aligned}$$

Generating new observation data = DD range!!!



Float Solution (Least Square)

$$\begin{bmatrix}
 \rho_n^1 - \rho_n^r - (\rho_m^1 - \rho_m^r) \\
 \vdots \\
 \rho_n^i - \rho_n^r - (\rho_m^i - \rho_m^r) \\
 \Phi_n^1 - \Phi_n^r - (\Phi_m^1 - \Phi_m^r) \\
 \vdots \\
 \Phi_n^i - \Phi_n^r - (\Phi_m^i - \Phi_m^r)
 \end{bmatrix} = \begin{bmatrix}
 \frac{x^1 - x_n}{R^1} & \frac{y^1 - y_n}{R^1} & \frac{z^1 - z_n}{R^1} & 0 & \dots & 0 \\
 \vdots & \vdots & \vdots & \vdots & \ddots & \vdots \\
 \frac{x^i - x_n}{R^i} & \frac{y^i - y_n}{R^i} & \frac{z^i - z_n}{R^i} & 0 & \dots & 0 \\
 \frac{x^1 - x_n}{R^1} & \frac{y^1 - y_n}{R^1} & \frac{z^1 - z_n}{R^1} & \lambda^1 N^1 & \dots & 0 \\
 \vdots & \vdots & \vdots & \vdots & \ddots & \vdots \\
 \frac{y^i - y_n}{R^i} & \frac{y^i - y_n}{R^i} & \frac{z^i - z_n}{R^i} & 0 & \dots & \lambda^i N^i
 \end{bmatrix} \begin{bmatrix}
 \Delta x_n \\
 \Delta y_n \\
 \Delta z_n \\
 \Delta N^1 \\
 \vdots \\
 \Delta N^i
 \end{bmatrix}$$

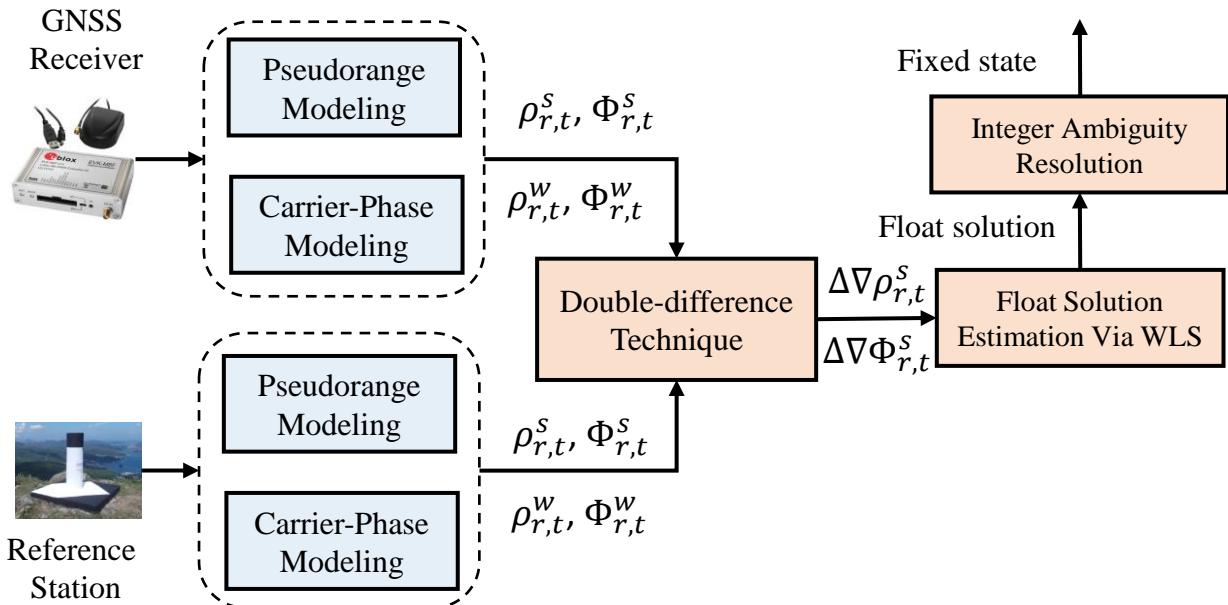
Double difference range (both pseudorange and carrierphase)

Float solution of the relative position between rover and ref stn

float ambiguity

Overview of GNSS Real-time Kinematic

WLS*: Weighted Least Squares
DD*: Double-difference

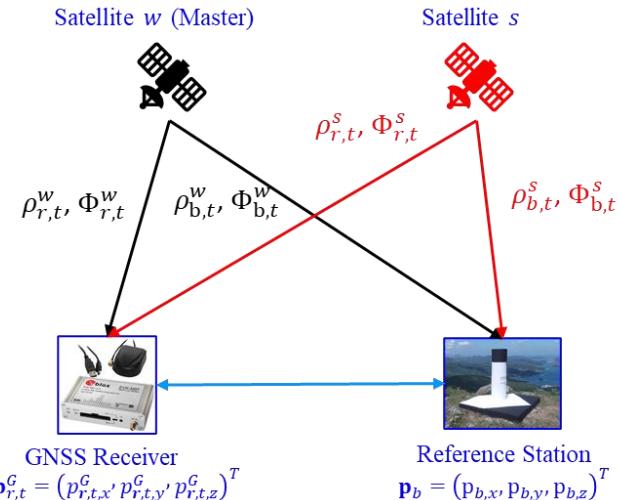


$\rho_{r,t}^s$: Pseudorange measurement

$\Phi_{r,t}^s$: Carrier-phase measurement

$\Delta\nu\rho_{r,t}^s$: DD Pseudorange measurement

$\Delta\nu\Phi_{r,t}^s$: DD Carrier-phase measurement



Why GNSS Real-time Kinematic?

- Remove the error from receiver/satellite clock bias, atmosphere error using double-difference technique.
- Use the high-accuracy carrier-phase measurements.

Observation Model for Pseudorange/Carrier Measurements

Observation function for pseudorange (code) measurement

$$\rho_{r,t}^s = r_{r,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) + I_{r,t}^s + T_{r,t}^s + \varepsilon_{r,t}^s$$

Pseudorange

Range distance Receiver clock Bias (1~2m) Satellite clock bias ionospheric delay Distance (1~2m) tropospheric delay Distance (1~2m)
 $\|\mathbf{p}_t^{G,s} - \mathbf{p}_{r,t}^G\|$

multipath effects, NLOS receptions, receiver noise, antenna phase-related noise (0~100m)

Observation function for carrier-phase measurement

$$\psi_{r,t}^s = r_{r,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) + I_{r,t}^s + T_{r,t}^s + \varepsilon_{r,t}^s + N_{r,t}^s$$

Carrier-phase range

range distance Receiver clock Bias (1~2m) Satellite clock bias ionospheric delay Distance (1~2m) tropospheric delay Distance (1~2m)
 $\|\mathbf{p}_t^{G,s} - \mathbf{p}_{r,t}^G\|$

multipath effects, NLOS receptions, receiver noise, antenna phase-related noise (0~100m)

Ambiguity

To use the carrier-phase measurements, the ambiguity need to be resolved.



Single Difference Pseudorange Measurements

Single difference between the GNSS receiver and the reference station to remove the atmosphere errors:

$$\rho_{r,t}^s = r_{r,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) + I_{r,t}^s + T_{r,t}^s + \varepsilon_{r,t}^s$$

$$\rho_{b,t}^s = r_{b,t}^s + c(\delta_{b,t} - \delta_{b,t}^s) + I_{b,t}^s + T_{b,t}^s + \varepsilon_{b,t}^s$$

$$\Delta\rho_{r,t}^s = \rho_{r,t}^s - \rho_{b,t}^s = r_{r,t}^s - r_{b,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) - c(\delta_{b,t} - \delta_{b,t}^s)$$

Satellite s

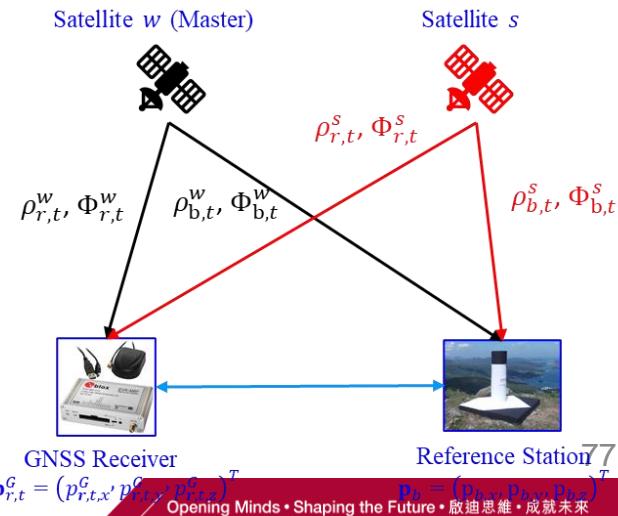
$$\rho_{r,t}^w = r_{r,t}^w + c(\delta_{r,t} - \delta_{r,t}^w) + I_{r,t}^w + T_{r,t}^w + \varepsilon_{r,t}^w$$

$$\rho_{b,t}^w = r_{b,t}^w + c(\delta_{b,t} - \delta_{b,t}^w) + I_{b,t}^w + T_{b,t}^w + \varepsilon_{b,t}^w$$

$$\Delta\rho_{r,t}^w = \rho_{r,t}^w - \rho_{b,t}^w = r_{r,t}^w - r_{b,t}^w + c(\delta_{r,t} - \delta_{r,t}^w) - c(\delta_{b,t} - \delta_{b,t}^w)$$

Satellite w (Master)

Assumption: GNSS receiver and the reference station are close with the same atmosphere errors





Double Difference Pseudorange Measurements

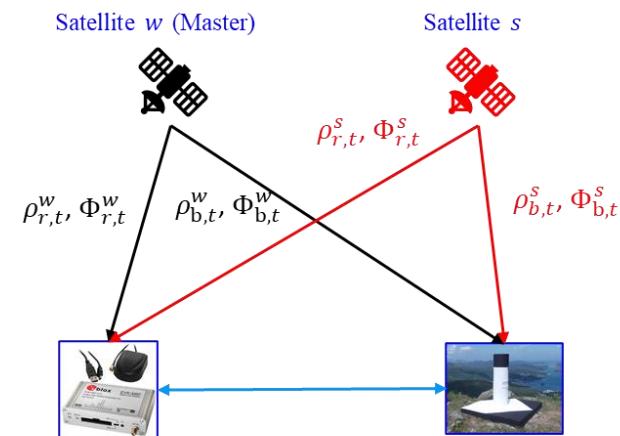
Second difference between the master satellite and the satellite s to remove the atmosphere errors:

$$\Delta\rho_{r,t}^s = \rho_{r,t}^s - \rho_{b,t}^s = r_{r,t}^s - r_{b,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) - c(\delta_{b,t} - \delta_{b,t}^s) \quad \text{Satellite } s$$

Assumption: GNSS receiver and the reference station are close with the same atmosphere errors

$$\Delta\rho_{r,t}^w = \rho_{r,t}^w - \rho_{b,t}^w = r_{r,t}^w - r_{b,t}^w + c(\delta_{r,t} - \delta_{r,t}^w) - c(\delta_{b,t} - \delta_{b,t}^w) \quad \text{Satellite } w \text{ (Master)}$$

$$\Delta\nabla\rho_{r,t}^s = \Delta\rho_{r,t}^s - \Delta\rho_{r,t}^w = \rho_{r,t}^s - \rho_{b,t}^s - \rho_{r,t}^w - \rho_{b,t}^w \quad \text{DD measurements}$$



$$\mathbf{p}_{r,t}^G = (p_{r,t,x}^G, p_{r,t,y}^G, p_{r,t,z}^G)^T \quad \mathbf{p}_b = (p_{b,x}, p_{b,y}, p_{b,z})^T$$

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Single Difference Carrier-phase Measurements

Single difference between the GNSS receiver and the reference station to remove the atmosphere errors:

$$\psi_{r,t}^s = r_{r,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) + I_{r,t}^s + T_{r,t}^s + \varepsilon_{r,t}^s + N_{r,t}^s$$

$$\psi_{b,t}^s = r_{b,t}^s + c(\delta_{b,t} - \delta_{b,t}^s) + I_{b,t}^s + T_{b,t}^s + \varepsilon_{b,t}^s + N_{b,t}^s \quad \text{Satellite } s$$

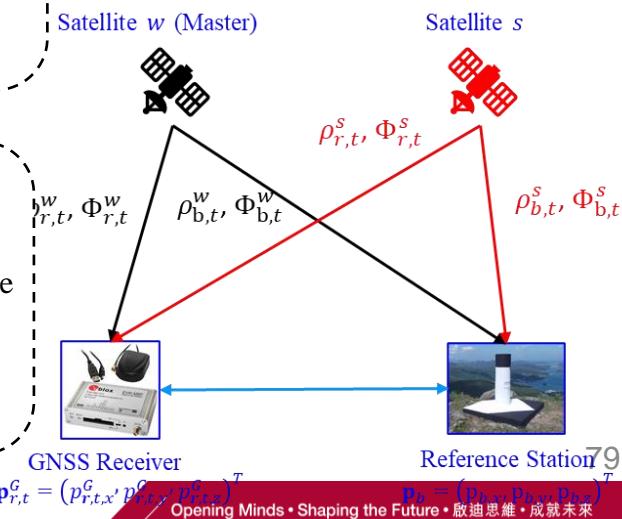
$$\Delta\psi_{r,t}^s = \psi_{r,t}^s - \psi_{b,t}^s = r_{r,t}^s - r_{b,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) - c(\delta_{b,t} - \delta_{b,t}^s) + N_{r,t}^s - N_{b,t}^s$$

$$\psi_{r,t}^w = r_{r,t}^w + c(\delta_{r,t} - \delta_{r,t}^w) + I_{r,t}^w + T_{r,t}^w + \varepsilon_{r,t}^w + N_{r,t}^w$$

$$\psi_{b,t}^w = r_{b,t}^w + c(\delta_{b,t} - \delta_{b,t}^w) + I_{b,t}^w + T_{b,t}^w + \varepsilon_{b,t}^w + N_{b,t}^w \quad \text{Satellite } w$$

$$\Delta\psi_{r,t}^w = \psi_{r,t}^w - \psi_{b,t}^w = r_{r,t}^w - r_{b,t}^w + c(\delta_{r,t} - \delta_{r,t}^w) - c(\delta_{b,t} - \delta_{b,t}^w) + N_{r,t}^w - N_{b,t}^w$$

Assumption: GNSS receiver and the reference station are close with the same atmosphere errors



$$\mathbf{p}_{r,t}^G = (p_{r,t,x}^G, p_{r,t,y}^G, p_{r,t,z}^G)^T$$

$$\mathbf{p}_b = (p_{b,x}, p_{b,y}, p_{b,z})^T$$



Double Difference Pseudorange Measurements

Second difference between the master satellite and the satellite s to remove the atmosphere errors:

$$\Delta\psi_{r,t}^s = \psi_{r,t}^s - \psi_{b,t}^s = r_{r,t}^s - r_{b,t}^s + c(\delta_{r,t} - \delta_{r,t}^s) - c(\delta_{b,t} - \delta_{b,t}^s) + N_{r,t}^s - N_{b,t}^s$$

Satellite s

$$\Delta\psi_{r,t}^w = \psi_{r,t}^w - \psi_{b,t}^w = r_{r,t}^w - r_{b,t}^w + c(\delta_{r,t} - \delta_{r,t}^w) - c(\delta_{b,t} - \delta_{b,t}^w) + N_{r,t}^w - N_{b,t}^w$$

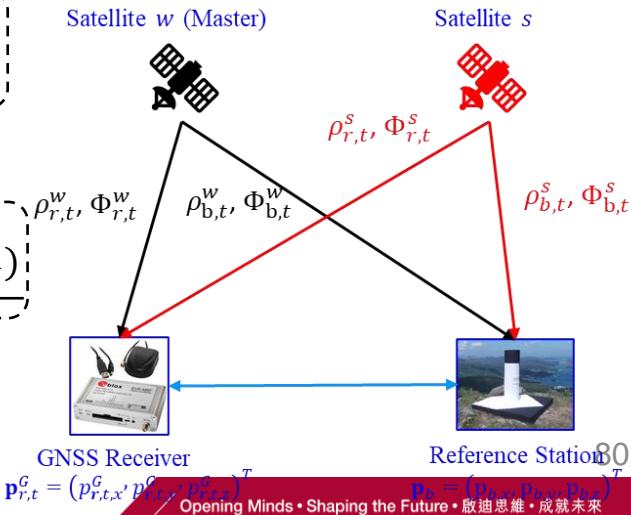
Satellite w (Master)

$$\Delta\nabla\psi_{r,t}^s = \Delta\psi_{r,t}^s - \Delta\psi_{r,t}^w = \rho_{r,t}^s - \rho_{b,t}^s - \rho_{r,t}^w - \rho_{b,t}^w + (N_{r,t}^s - N_{b,t}^s) - (N_{r,t}^w - N_{b,t}^w)$$

DD measurements

DD Ambiguity: $\Delta\nabla N_{r,t}^s$

Assumption: GNSS receiver and the reference station are close with the same atmosphere errors





GNSS Real-time Kinematic Positioning: Float Solution Estimation

Estimate the float solution via weighted least square positioning

$$\begin{bmatrix} \mathbf{p}_{r,t}^G \\ \Delta N_{r,t}^1 \\ \Delta N_{r,t}^2 \\ \vdots \\ \Delta N_{r,t}^{m-1} \end{bmatrix} = \left(\mathbf{G}_t^G {}^T \mathbf{W}_t \mathbf{G}_t^G \right)^{-1} \mathbf{G}_t^G {}^T \mathbf{W}_t \begin{bmatrix} \Delta \nabla \rho_{r,t}^1 \\ \Delta \nabla \rho_{r,t}^2 \\ \vdots \\ \Delta \nabla \rho_{r,t}^{m-1} \\ \Delta \nabla \psi_{r,t}^1 \\ \Delta \nabla \psi_{r,t}^2 \\ \vdots \\ \Delta \nabla \psi_{r,t}^{m-1} \end{bmatrix}$$

$\mathbf{p}_{r,t}^G$: Position of GNSS receiver

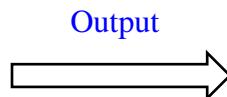
\mathbf{W}_t : Weighting matrix

m : number of satellite

\mathbf{G}_t^G : Observation matrix

$\Delta \nabla \rho_{r,t}^{m-1}$: DD pseudorange measurements

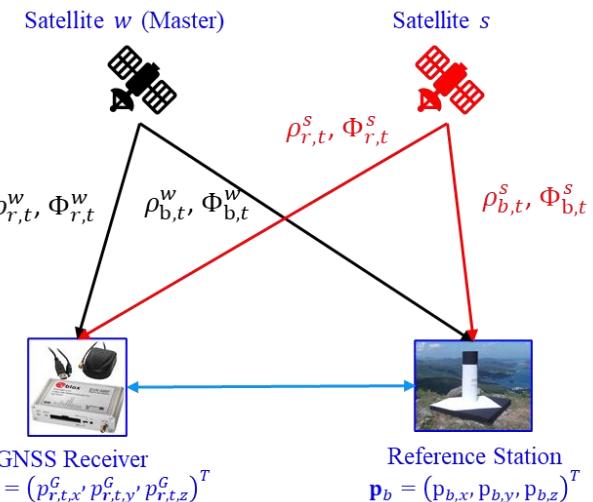
$\Delta \nabla \psi_{r,t}^{m-1}$: DD carrier-phase measurements



$\mathbf{p}_{r,t}^G$: Float solution of position of GNSS receiver

$\Delta \nabla N_{r,t}^1, \Delta \nabla N_{r,t}^2, \dots$: Float ambiguity

$(\mathbf{G}_t^G {}^T \mathbf{W}_t \mathbf{G}_t^G)^{-1}$: Covariance matrix



GNSS Real-time Kinematic Positioning: Ambiguity Resolution

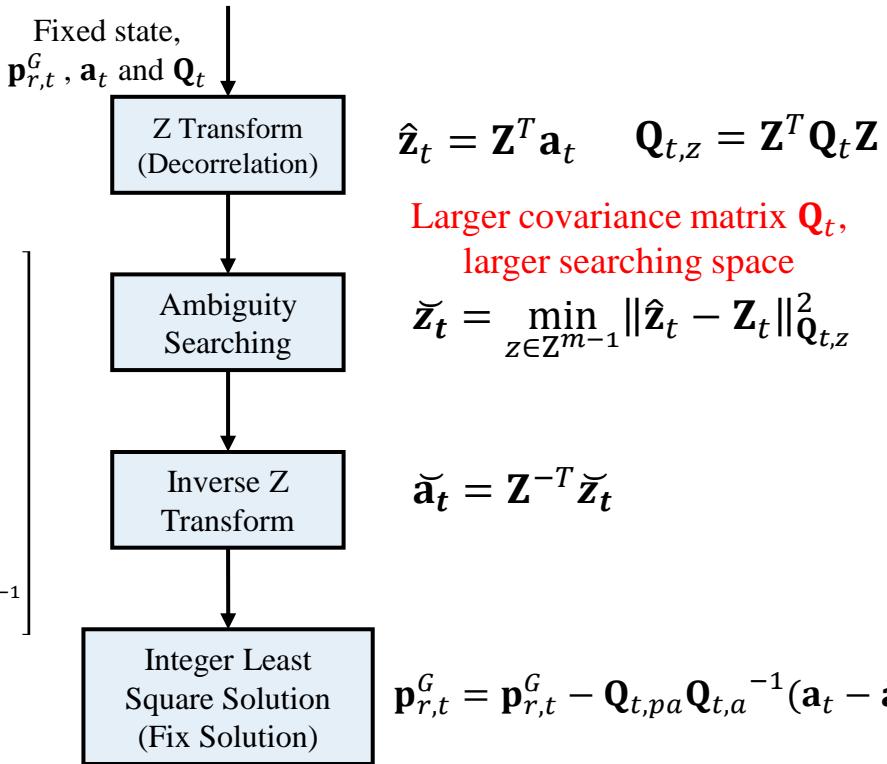
$\mathbf{p}_{r,t}^G$: Float solution of position of GNSS receiver

$\mathbf{a}_t = \Delta \nabla N_{r,t}^1, \Delta \nabla N_{r,t}^2, \dots$: Float ambiguity

$\mathbf{Q}_t = (\mathbf{G}_t^G)^T \mathbf{W}_t \mathbf{G}_t^G)^{-1}$: Covariance matrix

$$\mathbf{G}_t^G = \begin{bmatrix} \frac{p_{t,x}^{G,1} - p_{r,t,x}^G}{\|\mathbf{p}_t^{G,1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,y}^{G,1} - p_{r,t,y}^G}{\|\mathbf{p}_t^{G,1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,z}^{G,1} - p_{r,t,z}^G}{\|\mathbf{p}_t^{G,1} - \mathbf{p}_{r,t}^G\|} & 0 & \dots & 0 \\ \vdots & \vdots & \vdots & \vdots & \ddots & \vdots \\ \frac{p_{t,x}^{G,m-1} - p_{r,t,x}^G}{\|\mathbf{p}_t^{G,m-1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,y}^{G,m-1} - p_{r,t,y}^G}{\|\mathbf{p}_t^{G,m-1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,z}^{G,m-1} - p_{r,t,z}^G}{\|\mathbf{p}_t^{G,m-1} - \mathbf{p}_{r,t}^G\|} & 0 & \dots & 0 \\ \frac{p_{t,x}^{G,1} - p_{r,t,x}^G}{\|\mathbf{p}_t^{G,1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,y}^{G,1} - p_{r,t,y}^G}{\|\mathbf{p}_t^{G,1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,z}^{G,1} - p_{r,t,z}^G}{\|\mathbf{p}_t^{G,1} - \mathbf{p}_{r,t}^G\|} & \Delta \nabla N_{r,t}^1 & \dots & 0 \\ \vdots & \vdots & \vdots & \vdots & \ddots & \vdots \\ \frac{p_{t,x}^{G,m-1} - p_{r,t,x}^G}{\|\mathbf{p}_t^{G,m-1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,y}^{G,m-1} - p_{r,t,y}^G}{\|\mathbf{p}_t^{G,m-1} - \mathbf{p}_{r,t}^G\|} & \frac{p_{t,z}^{G,m-1} - p_{r,t,z}^G}{\|\mathbf{p}_t^{G,m-1} - \mathbf{p}_{r,t}^G\|} & 0 & \dots & \Delta \nabla N_{r,t}^{m-1} \end{bmatrix}$$

The correct fixed solution relies on the accuracy of float solution $\mathbf{p}_{r,t}^G$ and the covariance matrix \mathbf{Q}_t .



$$\hat{\mathbf{z}}_t = \mathbf{Z}^T \mathbf{a}_t \quad \mathbf{Q}_{t,z} = \mathbf{Z}^T \mathbf{Q}_t \mathbf{Z}$$

Larger covariance matrix \mathbf{Q}_t ,
larger searching space

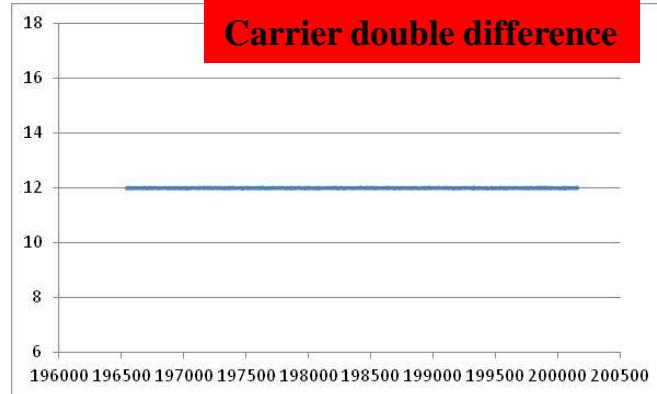
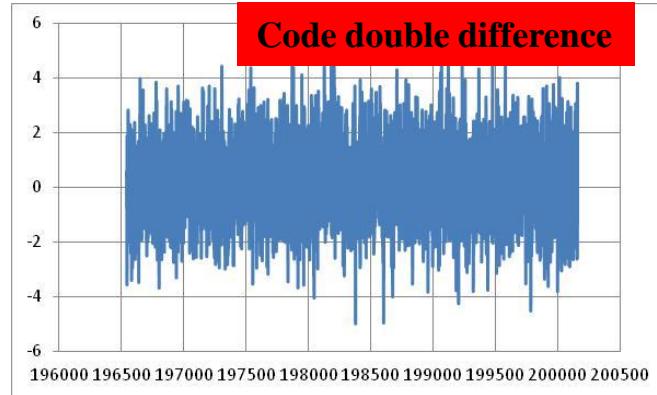
$$\breve{\mathbf{z}}_t = \min_{z \in Z^{m-1}} \|\hat{\mathbf{z}}_t - \mathbf{Z}_t z\|_{\mathbf{Q}_{t,z}}^2$$

$$\breve{\mathbf{a}}_t = \mathbf{Z}^{-T} \breve{\mathbf{z}}_t$$

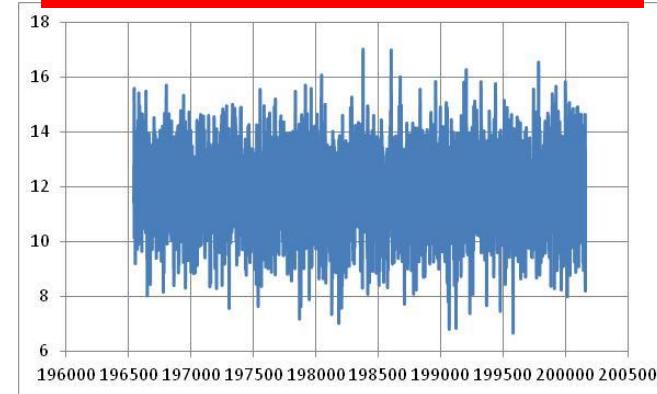
$$\mathbf{p}_{r,t}^G = \mathbf{p}_{r,t}^G - \mathbf{Q}_{t,pa} \mathbf{Q}_{t,a}^{-1} (\mathbf{a}_t - \breve{\mathbf{a}}_t)$$

Double Differenced Observation

(open sky condition : prn19->prn3 : 1 hour)



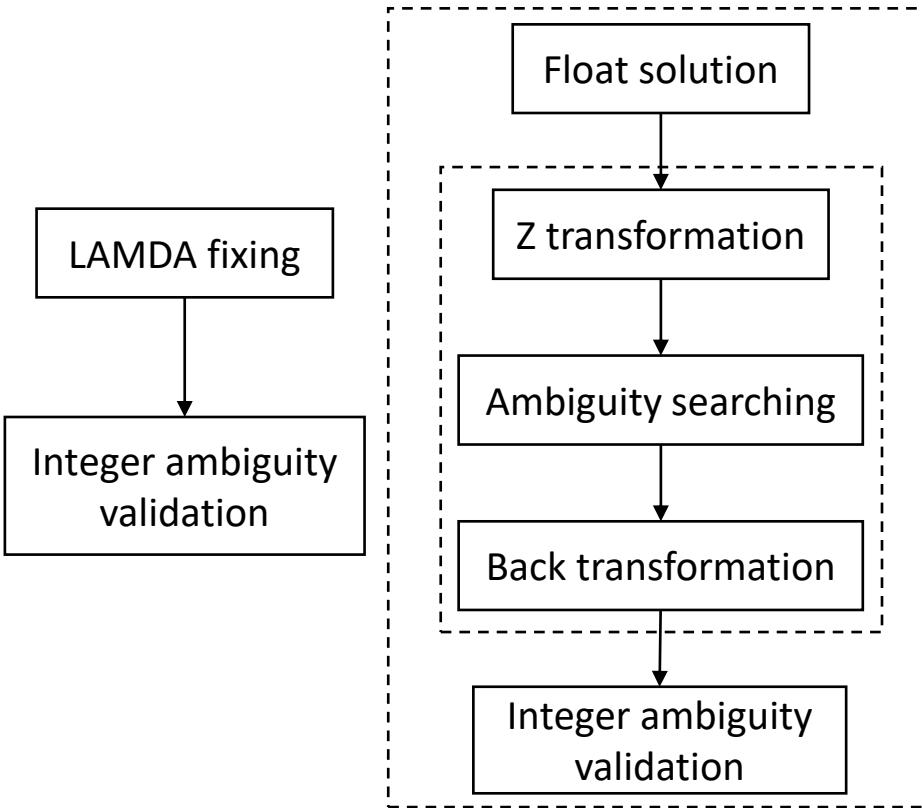
Ambiguity = Carrier DD – Code DD



Average = 11.8
Std = 1.4



Ambiguity Resolution by LAMBDA



Integer ambiguity validation

$Q_{\hat{a}}$: covariance matrix of ambiguity

\hat{a} : estimate ambiguity float

\check{a}_u, \check{a}_l : upper & lower bound of integer ambiguity

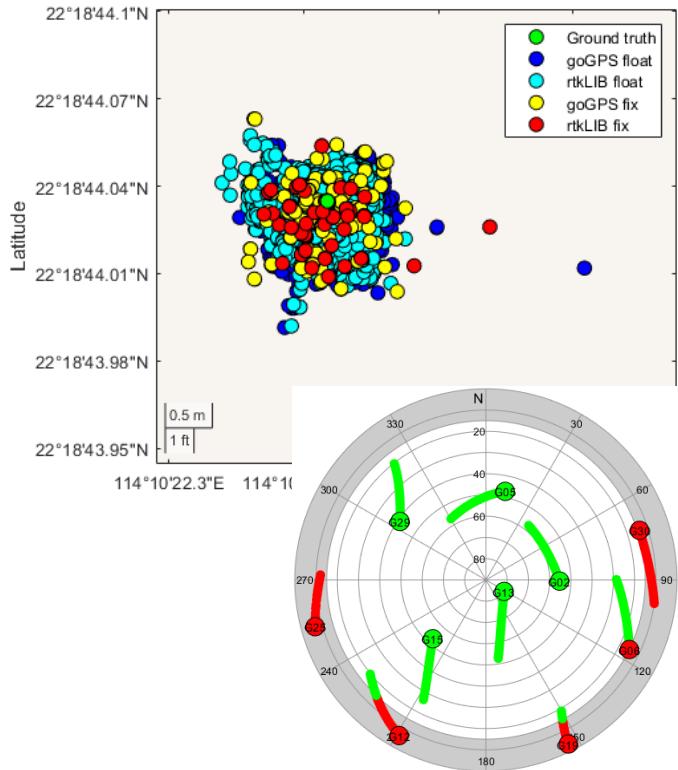
Nominator component $O_1 = (\hat{a} - \check{a}_l)Q_{\hat{a}}^{-1}(\hat{a} - \check{a}_l)$

Denominator component $O_2 = (\hat{a} - \check{a}_u)Q_{\hat{a}}^{-1}(\hat{a} - \check{a}_u)$

Ratio test $O = O_2/O_1 > 3$



Test RTK Fix



Receiver: ublox F9P

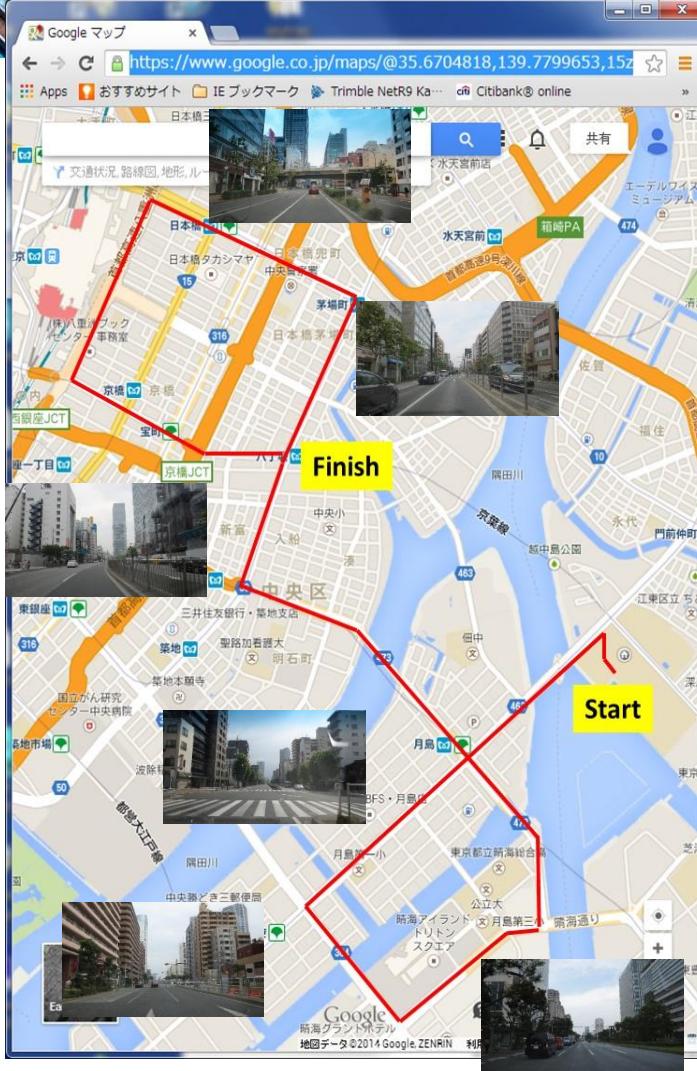
Constellation: GPS

Frequency: L1 only

Epochs: 3562 (00:59:22); 3533 available

Elev. mask: 15°; SNR mask: 15

Method	Fixing Rate (%)	RMS 2D Error (m)		
		Fix	Float	All
goGPS	15.34	0.476	0.396	0.409
RTKLIB (2.4.3 b33)	20.10	0.197	0.386	0.356
WLS	100		0.805	



Multi-GNSS RTK Test using Car

Test	Schedule
1st	2014/8/13 13:07–13:32
2nd	2014/8/13 17:26–17:52
3rd	2014/8/13 22:26–22:50
4th	2014/8/14 8:36–9:02
5th	2014/8/14 12:07–12:35

- * GPS/QZS/GLONASS/GALILEO/BeiDou are entirely used in this test
- * Trimble SPS855 receiver was used
- * RTK : Trimble and Laboratory engine

Summary of Test Results

Multi-GNSS RTK

	Average NUS	Fix rate
Test 1	12.3	58.7%
Test 2	12.3	75.4%
Test 3	13.6	65.5%
Test 4	12.4	60.0%
Test 5	14.2	70.5%

FIX rate comparison between GNSS combinations

GPS VS. Multi-GNSS RTK
(using two same receivers : SPS855)

Test 5	Average NUS	Fix rate
GPS	5.8	26.8%
Multi-GNSS	14.2	70.5%

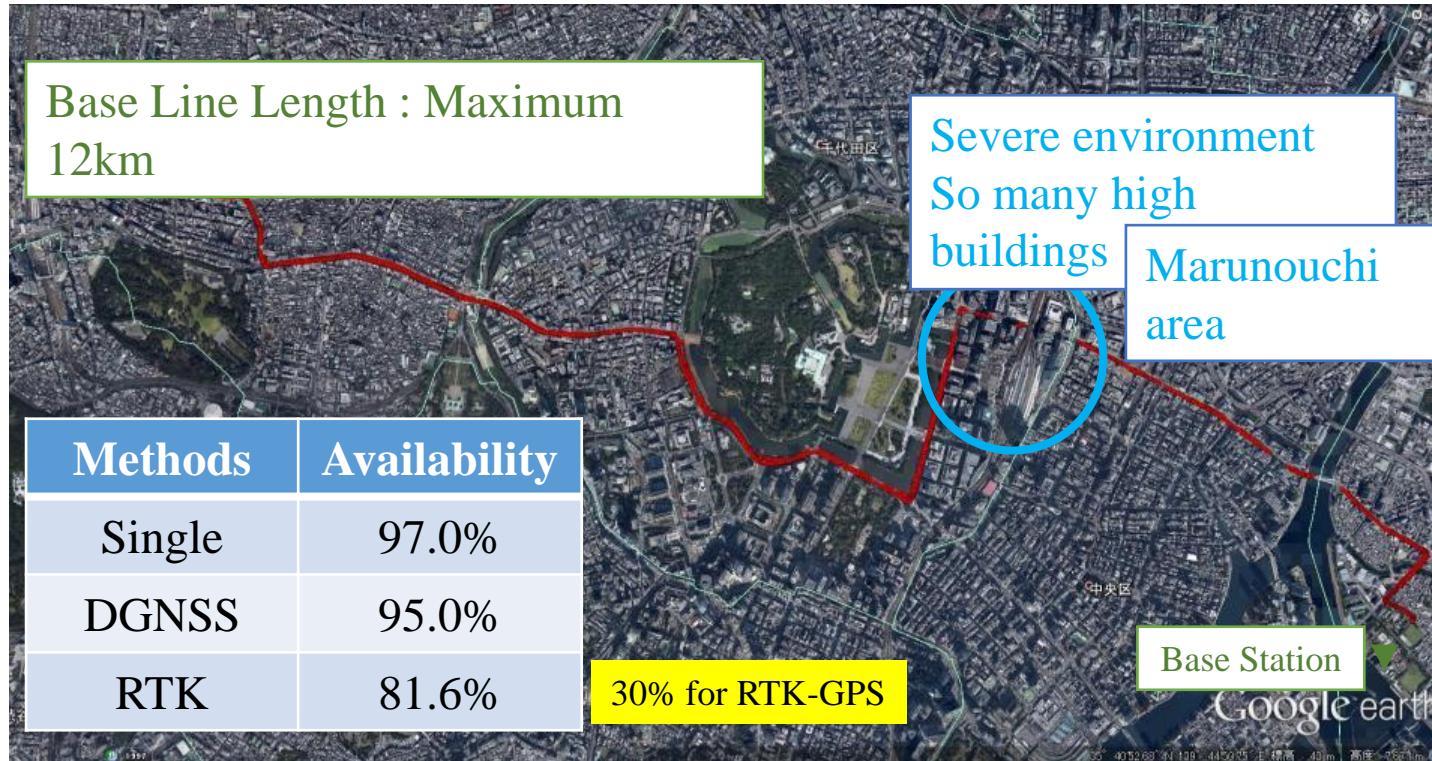
Velocity : Doppler based velocity output
G:GPS J:QZSS C:BeiDou R:GLONASS

Test 3	G	GJ	GC	GR	GJC	GJCR
RTK FIX rate (%)	48.2	58.2	55.5	55.4	64.7	65.9

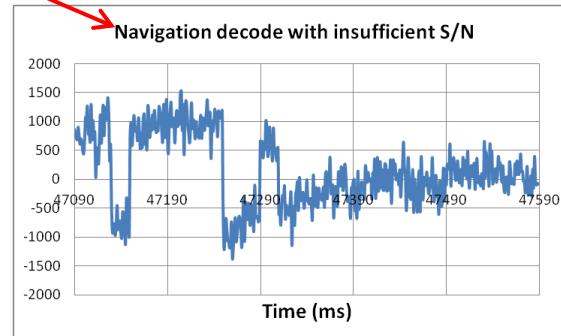
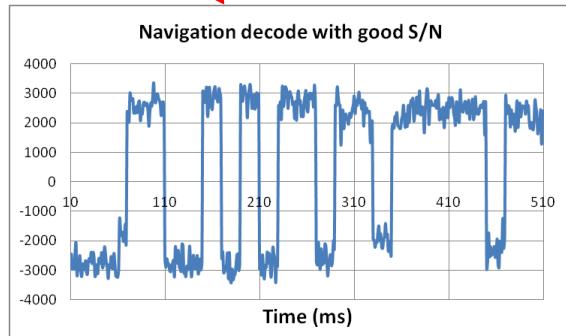
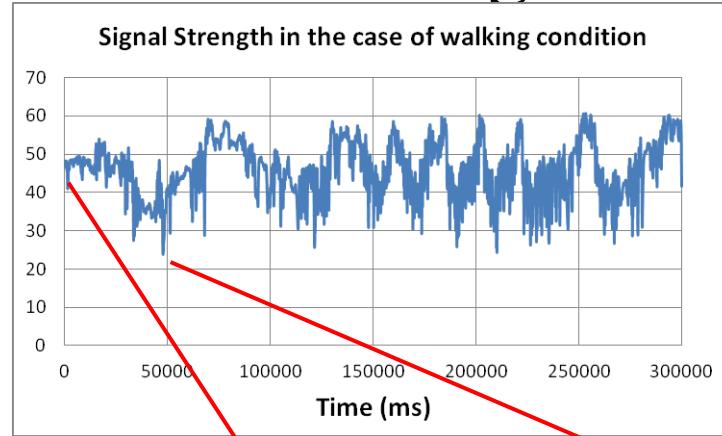
The reason for small contribution of BeiDou/GLONASS to RTK was just due to the shortage of high elevation those satellites



Height Determination using Automobile



How about indoor? 5 min IMES tracking in Lab.



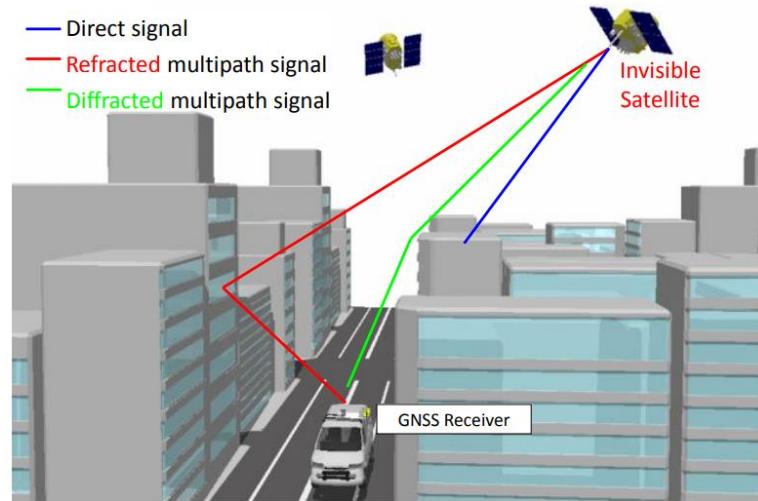
Front-end



Improve GNSS Positioning

> 3D Mapping Aided (3DMA) GNSS:

- Suzuki, Taro and Kubo, Nobuaki. GNSS positioning with multipath simulation using 3D surface model in urban canyon. (*ION GNSS+ 2012*). (GNSS NLOS exclusion causes poor satellite geometry)



Prof. Kubo, 2012

90/70



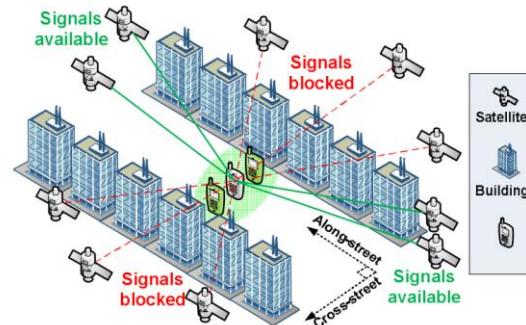
Improve GNSS Positioning

> 3D Mapping Aided (3DMA) GNSS:

- Wang, Lei, et al. "Urban positioning on a smartphone: Real-time shadow matching using GNSS and 3D city models." *Navigation, The Institute of Navigation*, 2013. (Relies on the satellite visibility classification and the initial guess of the receiver)
- Hsu, Li-Ta, et al. "3D building model-based pedestrian positioning method using GPS/GLONASS/QZSS and its reliability calculation." *GPS solutions*, 2016. (Relies on the initial guess of the receiver and causes high computation load)



Hsu, 2016



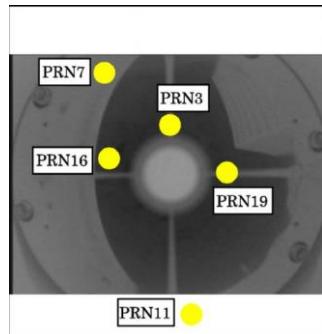
Wang, 2013



Improve GNSS Positioning

> Camera-aided GNSS Positioning:

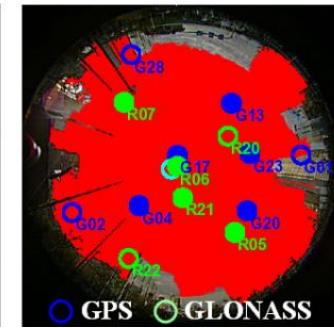
- Meguro, Jun-ichi, et al. "GPS multipath mitigation for urban area using omnidirectional infrared camera." *IEEE Transactions on Intelligent Transportation Systems*, 2013. (**NLOS exclusion cause poor geometry**)
- Suzuki, Taro and Kubo, Nobuaki, "N-LOS GNSS Signal Detection Using Fish-Eye Camera for Vehicle Navigation in Urban Environments," (*ION GNSS+ 2014*), Tampa, Florida, September 2014. (**NLOS detection and exclusion with monocular camera, cause poor satellite geometry**)



Meguro, 2013



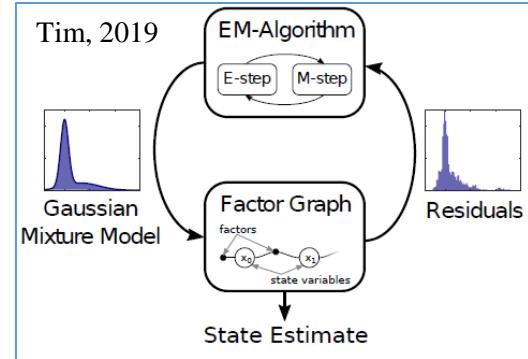
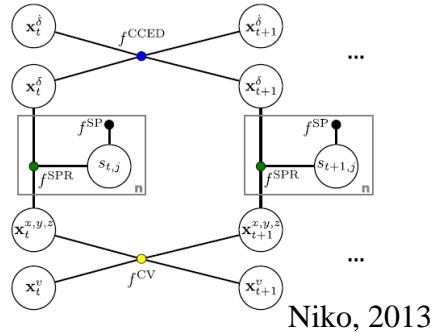
Kubo, 2014



Improve GNSS Positioning

> Robust Model-aided GNSS Positioning:

- Sünderhauf, et al. "Switchable constraints and incremental smoothing for online mitigation of non-line-of-sight and multipath effects. *IEEE IV* 2013. (Relyes on the initial guess of the prior factor)
- Pfeifer, Tim, et al. "Dynamic Covariance Estimation—A parameter free approach to robust Sensor Fusion." *IEEE MFI* 2017. (Relyes on the percentage of healthy measurements)
- Pfeifer, Tim, and Peter Protzel. "Expectation-maximization for adaptive mixture models in graph optimization." *ICRA*, 2019. (Relyes on the initial guess of the state estimation)





References

- > Chapters 5 and 6.1-4 - Collinson R.P.G.,
Introduction to Avionics Systems, Third Edition,
Springer, Feb 2011

- > Chapter 2, Paul D. Groves, *Principles of GNSS,
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Systems, 2nd Edition*, Artech House, 2013.



Q&A

Thank you for your attention ☺

Q&A

Dr. Weisong Wen

If you have any questions or inquiries,
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