



# SaPPART Training School

## Fundamentals of GNSS for ITS applications

GPS observations and  
positioning

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University of Aveiro  
Portugal

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Ifsttar

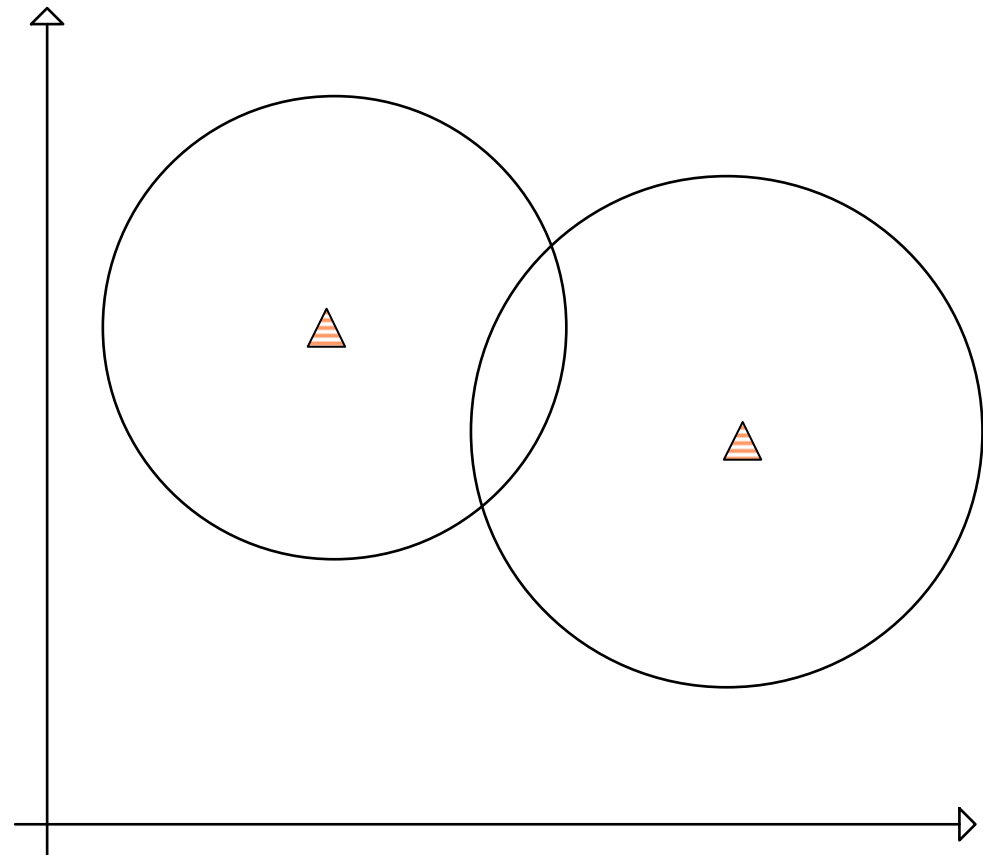
# Contents

- GPS observations
  - Code
  - Phase
- GPS positioning
  - Using code
  - Standard
  - Differential
- Kinematic GPS
  - Using phase and solving ambiguities

# Trilateration

- measuring distances to known points (beacons)

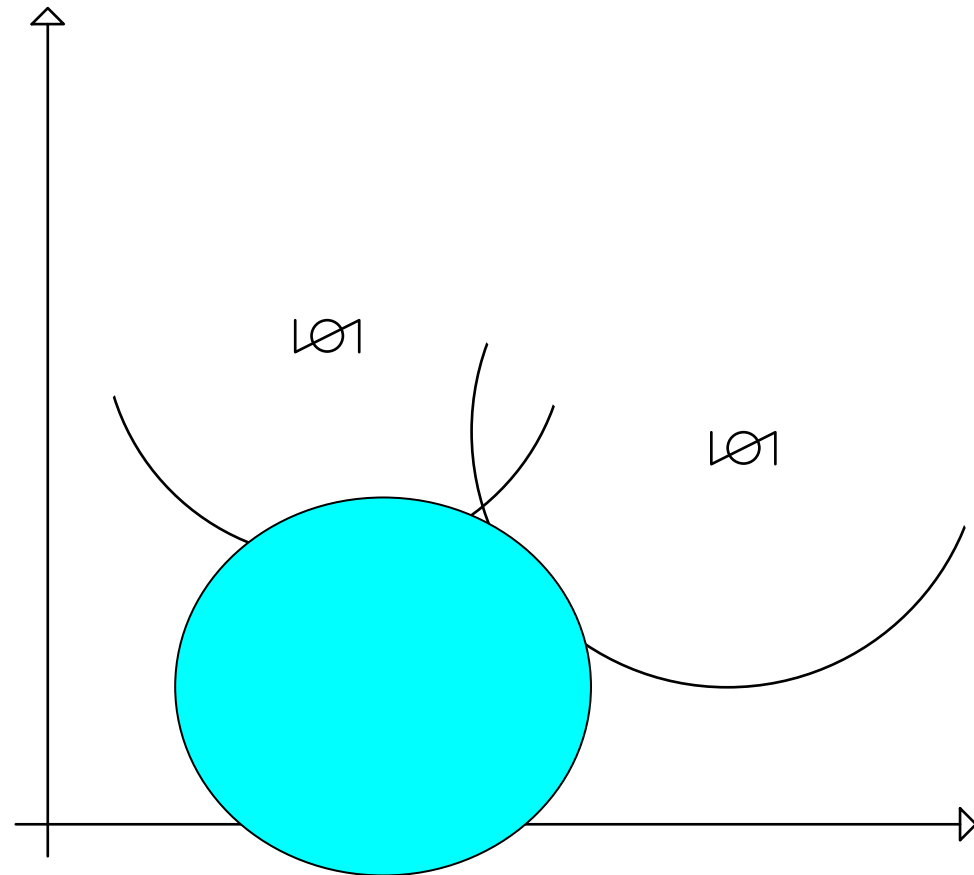
**2D ( $n$  cercles)  
=> 2 solutions**



# Trilateration

- measuring distances to known points (beacons)

**2D ( $n$  cercles)  
top-down sat  
to earth signal  
 $\Rightarrow$  1 solution**



# Trilateration

## Solution of the problem

2 unknown  $\rightarrow$  2 points (beacons:  $x_1y_1$  and  $x_2y_2$ ) are needed

More points give redundancy (over-determination):

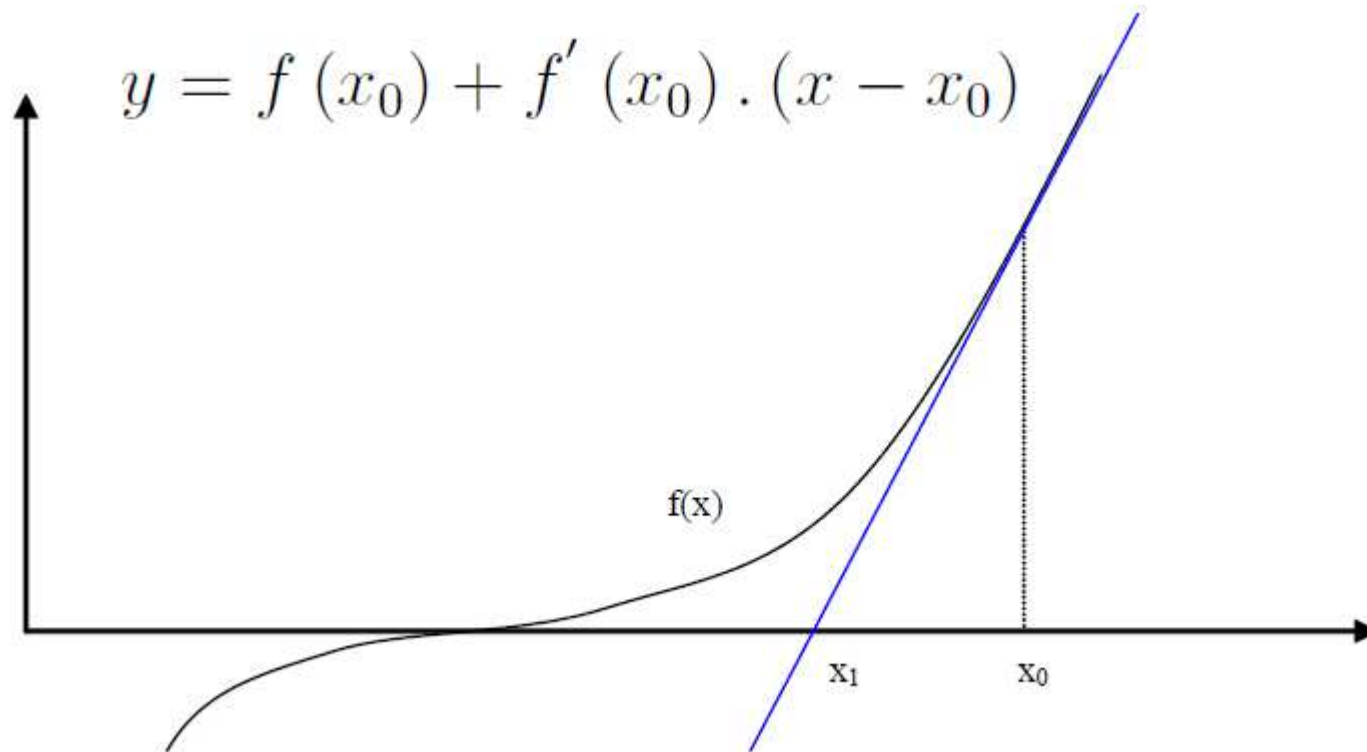
$$\rho_1 = \sqrt{(x_1 - x_u)^2 + (y_1 - y_u)^2}$$

$$\rho_2 = \sqrt{(x_2 - x_u)^2 + (y_2 - y_u)^2}$$

One can solve this system by **iterative linearization** and **least squares** (or by **Kalman filtering** under dynamic hypotheses), starting from an approximate solution

# Iterative method (Newton-Raphson)

Like solving  $f(x)=0$  with a scalar non linear fonction f



# Linearization

**In the vicinity of an approximate  $x_o, y_o$  solution**

Newton-Raphson derivation:

$$\rho_1 = \sqrt{(x_1 - x_o)^2 + (y_1 - y_o)^2} + d\rho_1/dx (x_u - x_o) + d\rho_1/dy (y_u - y_o)$$

$$\rho_2 = \sqrt{(x_2 - x_o)^2 + (y_2 - y_o)^2} + d\rho_2/dx (x_u - x_o) + d\rho_2/dy (y_u - y_o)$$

$$\rho_1 = \rho_{1o} - (x_1 - x_o)/\rho_{1o} (x_u - x_o) - (y_1 - y_o)/\rho_{1o} (y_u - y_o)$$

$$\rho_2 = \rho_{2o} - (x_2 - x_o)/\rho_{2o} (x_u - x_o) - (y_2 - y_o)/\rho_{2o} (y_u - y_o)$$

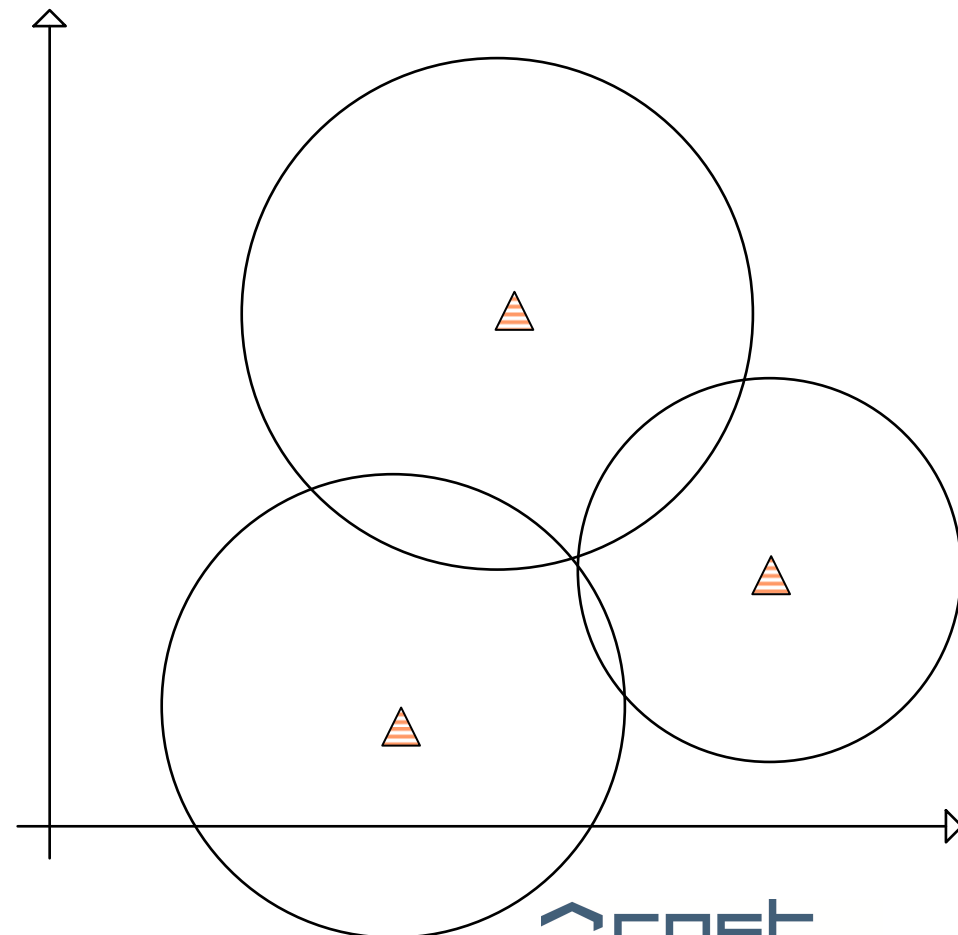
$$\begin{bmatrix} \rho_1 - \rho_{1o} \\ \rho_2 - \rho_{2o} \end{bmatrix} = \begin{bmatrix} -(x_1 - x_o)/\rho_{1o} & -(y_1 - y_o)/\rho_{1o} \\ -(x_2 - x_o)/\rho_{2o} & -(y_2 - y_o)/\rho_{2o} \end{bmatrix} \begin{bmatrix} x_u - x_o \\ y_u - y_o \end{bmatrix}$$

$$Y = AX$$

# Over-determination

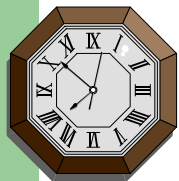
- measuring distances to **more** known points than strictly needed

2D ( $n$  cercles)  
redundancy  
=> test meas,  
optimization...





# Measuring satellite-receiver distance

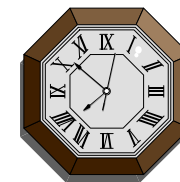
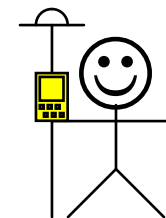
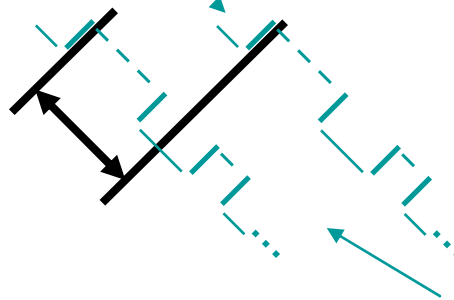


Satellite:  
binary code  
starting at  $t = 0$

speed of light  $\sim 3^e8$  m/s

distance  $\sim 75^e-6 \times 3^e8 = 22500$  km  
conditionnally to a perfect  
synchronization of the clocks

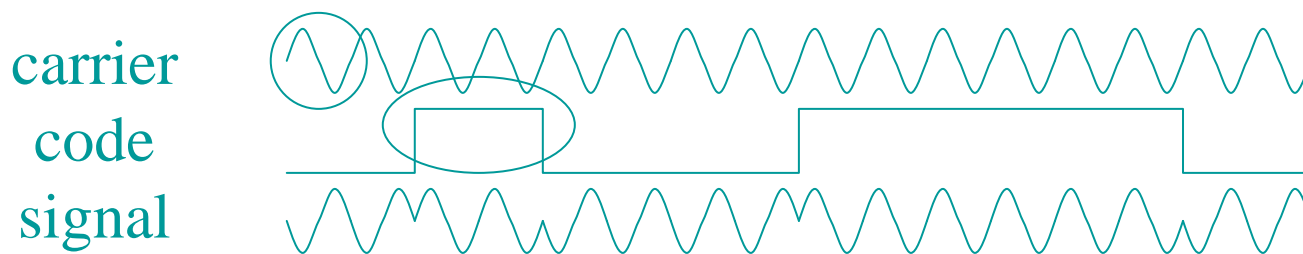
Measured  
delta = 75 ms  
(e.g.)



Receiver: same code

# GPS code and phase (for L1 carrier)

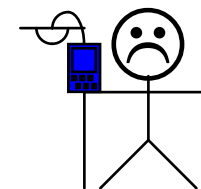
GPS L1 (1.5 GHz) decomposition:



- code (long 300 m): sub-metre tracking noise level
- L1 carrier (long 0.19 m): mm tracking noise level
- travel time and distance with ambiguity (modulo  $2\pi$ ): one measures the variation of this distance

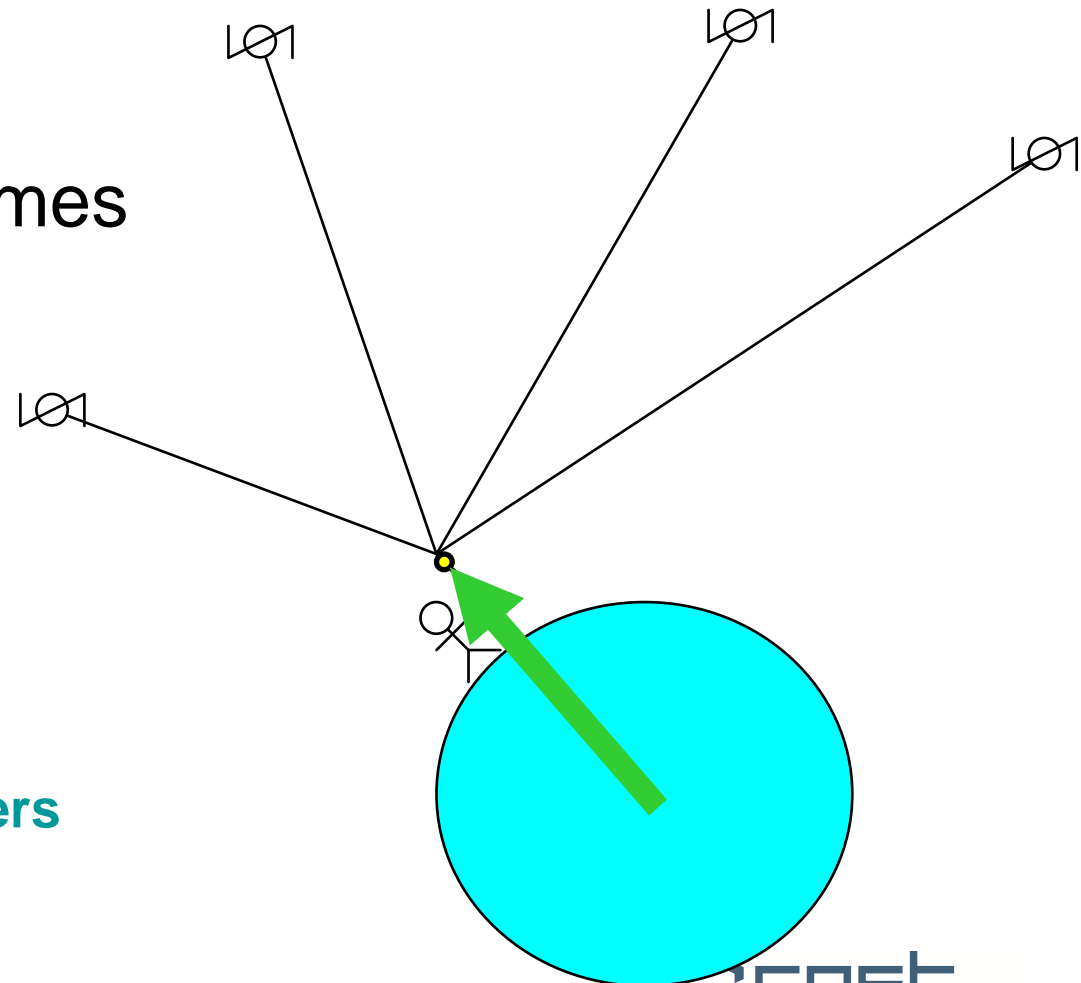
# Main problems...

- clock offsets
- orbital errors
- atmosphere delays
- low signal-to-noise ratio and multipath (reflection and diffraction locally at the receiver)



# Standard GPS positioning service

- using code
- measuring travel times  
i.e. distances



precision: a few meters

# GPS positioning / code (1)

## Observation equation and position of the problem

$$\rho_j = R_j + c \cdot dt \quad (1) \quad (c: \text{speed of light})$$

- ◆  $\rho_j$ : measured pseudo-range
- ◆  $R_j$ : true geometric distance bw the receiver and the satellite  $j$ :  $R_j = \|\mathbf{s}_j - \mathbf{u}\|$  with

$$\mathbf{s}_j = (x_j \ y_j \ z_j)^T \text{ coordinates of the satellite } j$$

$$\mathbf{u} = (x_u \ y_u \ z_u)^T \text{ coordinates of the receiver}$$

- ◆  $dt$ : receiver clock offset / GPS time

Note: one applies models for satellite clock offsets and atmospheric delays and one neglects other error terms (multipath, thermal noise...).

# GPS positioning / code (2)

## Observation equation and position of the problem

4 unknown → 4 satellites are needed

The following system must be solved, with 4 equations and

4 unknown:  $x_u, y_u, z_u, dt$   $j = 1$  to  $4$ :

$$\rho_j = \sqrt{(x_j - x_u)^2 + (y_j - y_u)^2 + (z_j - z_u)^2} + c \cdot dt$$

$$\rho_j = f_j(x_u, y_u, z_u, dt) \quad (2)$$

One can solve this system by **iterative linearization** and **least squares** (or by **Kalman filtering** under dynamic hypotheses), starting from an approximate solution

# Linearization (1)

**The function  $f$  is non linear and it should be linearized**

- Let  $\mathbf{u}' = (x'_u \ y'_u \ z'_u \ dt')^T$  be an approximate solution
- One computes the approximate pseudo-ranges from this solution:  $\rho'_j = f_j(x'_u, y'_u, z'_u, dt')$  (3)

One notes:

$$x_u = x'_u + \Delta x_u$$

$$y_u = y'_u + \Delta y_u$$

$$z_u = z'_u + \Delta z_u$$

$$dt = dt' + \Delta dt$$

- Linearization of (2) around the approximate solution:

$$f_j(x_u, y_u, z_u, dt) = f_j(x'_u + \Delta x_u, y'_u + \Delta y_u, z'_u + \Delta z_u, dt' + \Delta dt) \quad (4)$$

# Linearization (2)

- 1st order Taylor development:

$$f_j(x_u, y_u, z_u, dt) = f_j(x'_u, y'_u, z'_u, dt') + \frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial x'_u} \Delta x_u + \frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial y'_u} \Delta y_u + \frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial z'_u} \Delta z_u +$$

- Derivatives of (2) are:

$$\frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial x'_u} = -\frac{x_j - x'_u}{r'_j} \quad \frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial dt'} \Delta dt$$

$$\frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial y'_u} = -\frac{y_j - y'_u}{r'_j} \quad (5)$$

$$\frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial z'_u} = -\frac{z_j - z'_u}{r'_j} \quad \text{and} \quad \frac{\partial f(x'_u, y'_u, z'_u, dt')}{\partial dt'} = c$$

with:  $r'_j = \sqrt{(x_j - x'_u)^2 + (y_j - y'_u)^2 + (z_j - z'_u)^2}$



# Linearization (3)

- Reporting into (5), one gets:

$$\rho_j = \rho'_j - \frac{x_j - x'_u}{r'_j} \Delta x_u - \frac{y_j - y'_u}{r'_j} \Delta y_u - \frac{z_j - z'_u}{r'_j} \Delta z_u + c \Delta dt \quad (6)$$

The observation equation (2) has been linearized in function of the unknown  $\Delta x_u$ ,  $\Delta y_u$ ,  $\Delta z_u$  and  $\Delta dt$

(Note: keep in mind that  $\rho'_j$  is known and  $\rho_j$  is measured)

# Linearization (4)

• Denoting:  $\Delta\rho_j = \rho_j - \rho'_j$

$\rho'_j$  known and  $\rho_j$  measured

$a_{xj}$ ,  $a_{yj}$ ,  $a_{zj}$  : cosine of unit vector  $\mathbf{a}_j$   
pointing satellite  $j$  from  
the approximate solution  
equation (6) becomes:

$$a_{xj} = (x_j - x'_u) / r'_j$$

and:  $a_{yj} = (y_j - y'_u) / r'_j$

$$a_{zj} = (z_j - z'_u) / r'_j$$

$$\Delta\rho_j = a_{xj}\Delta x_u + a_{yj}\Delta y_u + a_{zj}\Delta z_u + c\Delta t \quad (7)$$

# GPS positioning / code (3)

## Inversion of the linearized system

- With:
 
$$\Delta \rho = \begin{bmatrix} \Delta \rho_1 \\ \Delta \rho_2 \\ \Delta \rho_3 \\ \Delta \rho_4 \end{bmatrix} \quad H = \begin{bmatrix} a_{x1} & a_{y1} & a_{z1} & 1 \\ a_{x2} & a_{y2} & a_{z2} & 1 \\ a_{x3} & a_{y3} & a_{z3} & 1 \\ a_{x4} & a_{y4} & a_{z4} & 1 \end{bmatrix} \quad \Delta \mathbf{x} = \begin{bmatrix} \Delta x_u \\ \Delta y_u \\ \Delta z_u \\ c\Delta t \end{bmatrix}$$

one finally gets the following matrix equation:

$$\Delta \rho = H \Delta \mathbf{x} \quad (8) \text{ solved by: } \Delta \mathbf{x} = H^{-1} \Delta \rho \quad (9)$$

- One iterates this process until the norm of vector  $\Delta \rho$  gets below a certain limit

# GPS positioning / code (4)

## General case (> 4 satellites): over-determination

The solution  $\Delta \mathbf{x} = H^{-1} \Delta \rho$  exists in case the problem is exactly determined (in this case, H is a 4 x 4 matrix)

In case more than 4 satellites are observed, the problem is over-determined and equation (8) least-squares solution is obtained multiplying its 2 sides by  $H^T$ , then again by  $(H^T H)^{-1}$ : this is the pseudo-inverse or generalized inverse of H:

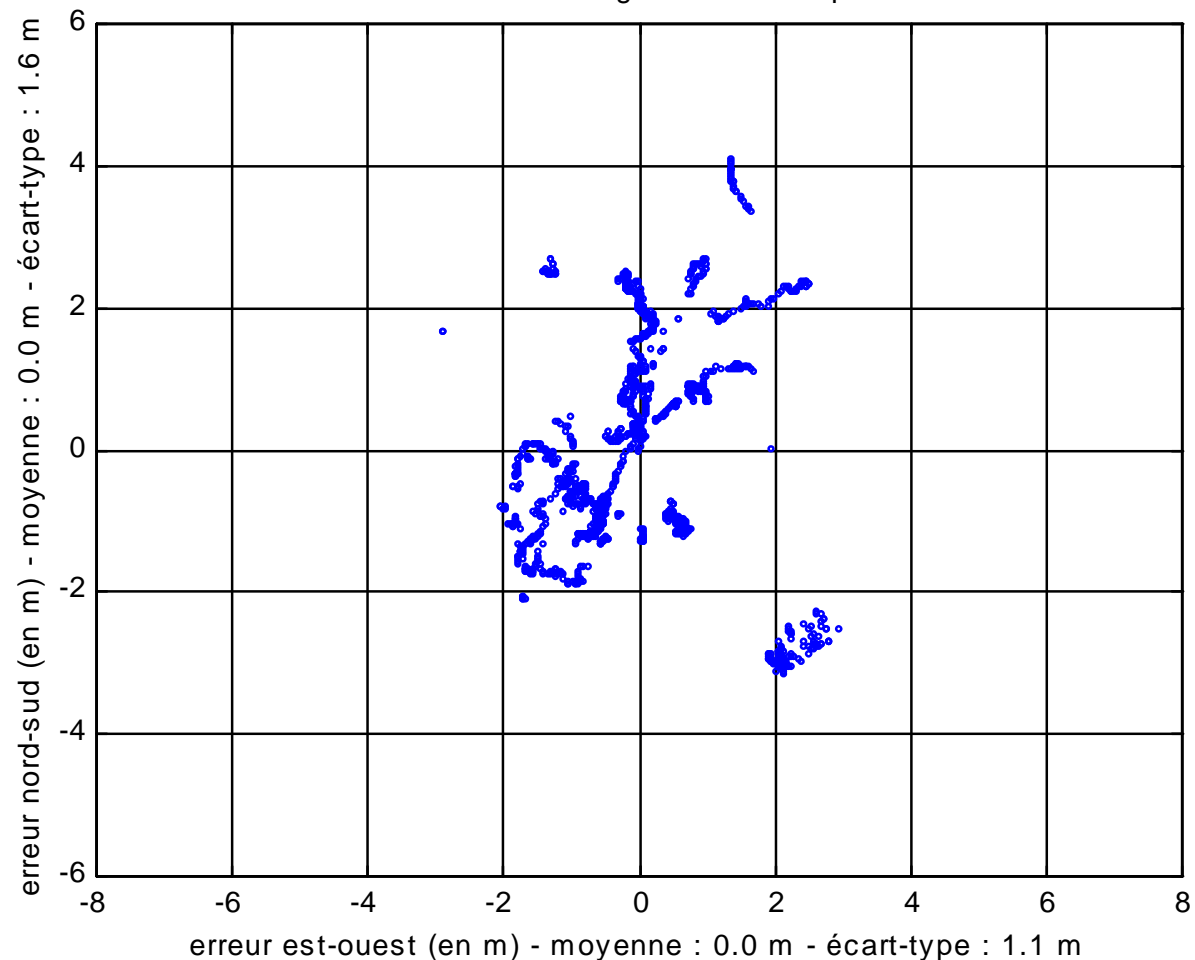
$$\Delta \mathbf{x} = (H^T H)^{-1} H^T \Delta \rho \quad (10)$$

Note: one demonstrates that this solution minimizes the sum of the squared residuals (so called least-squares solution)

# Standard GPS positioning service

**Diagram of the horizontal error typical of the GPS standard service, for 24h. Observations collected near Nantes, in may 2003**

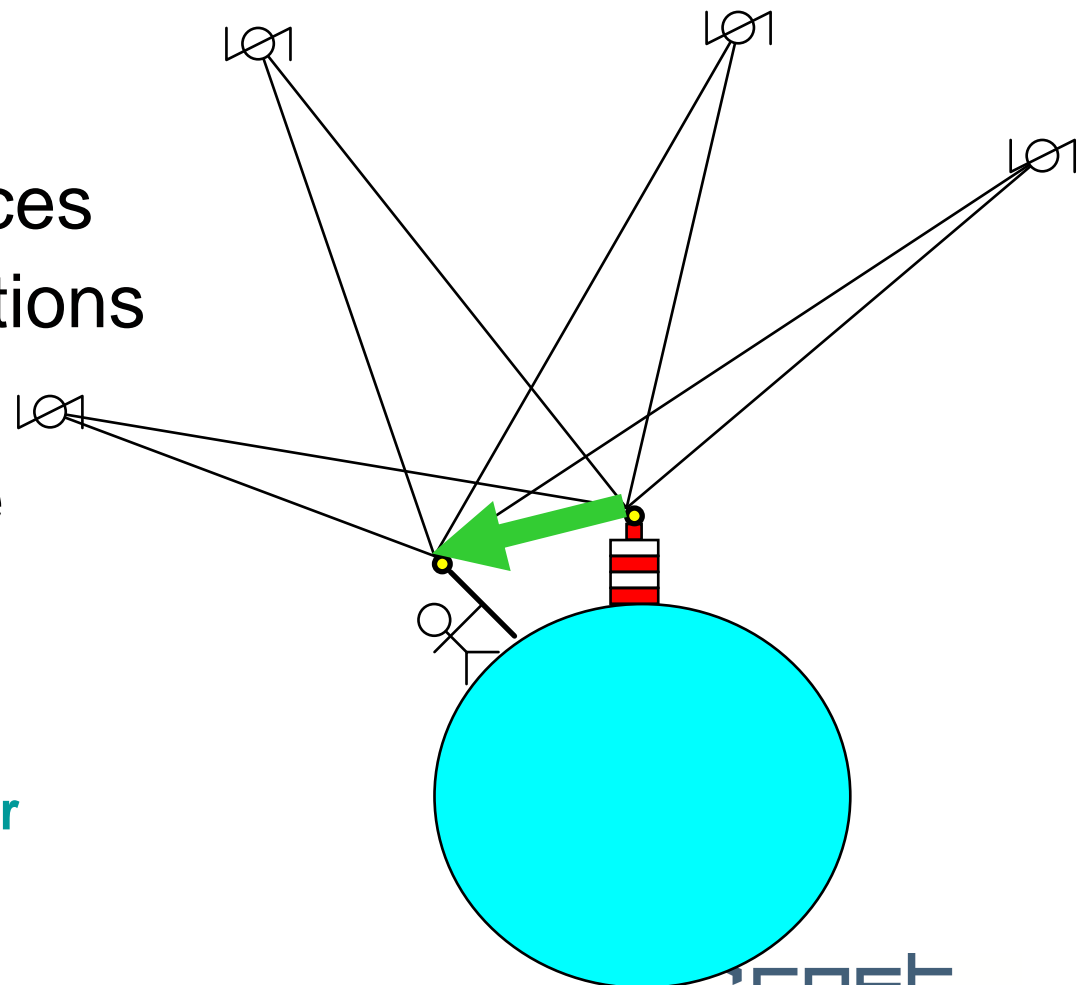
GPS naturel - solution de navigation en statique le 21 mai 2003



# Differential GPS

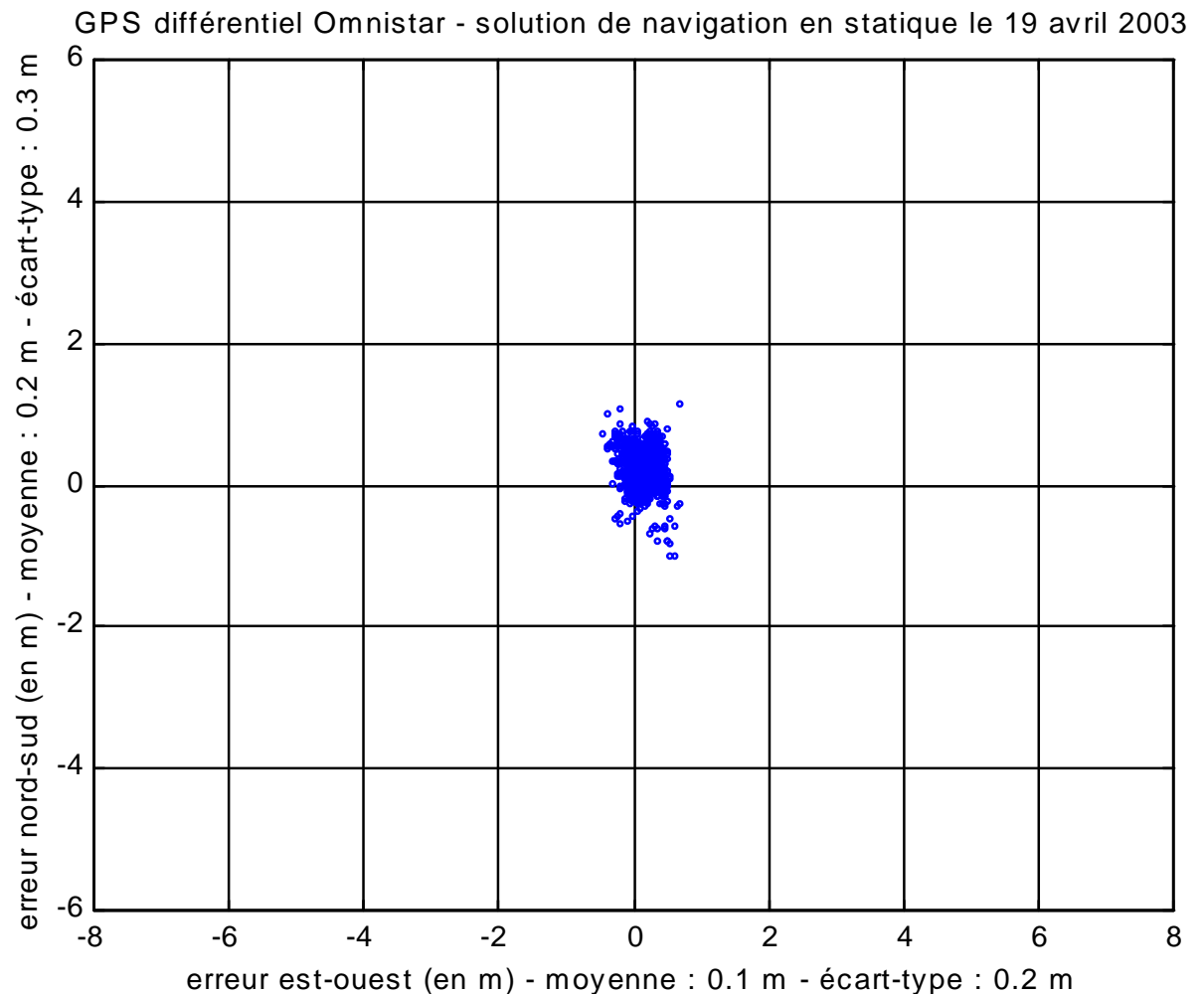
- using code
- measuring distances
- correlated perturbations  
(base and rover)
- using one base  
or a network

precision: (sub-)meter



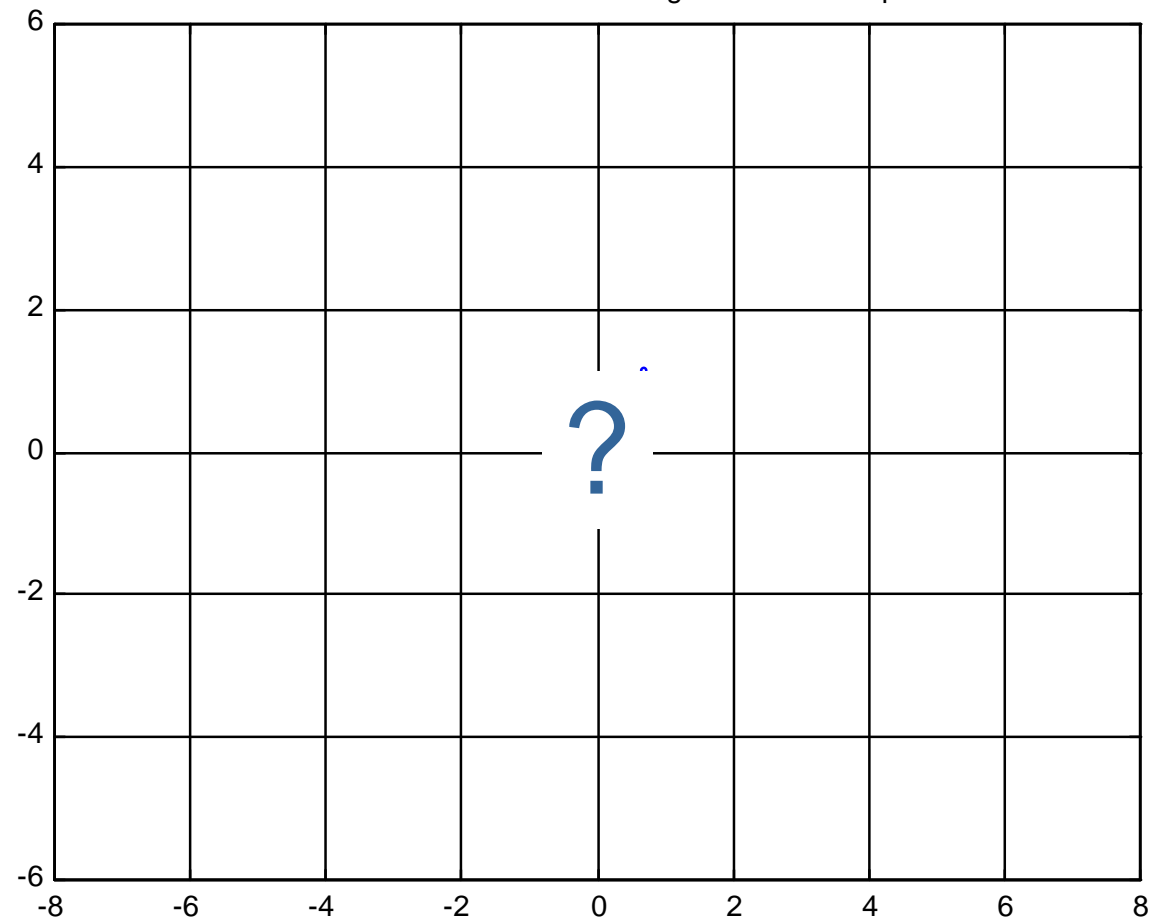
# Omnistar DGPS positioning service

**Diagram of the horizontal error typical of the DGPS Omnistar network, for 24h. Observations collected near Nantes, in april 2003**



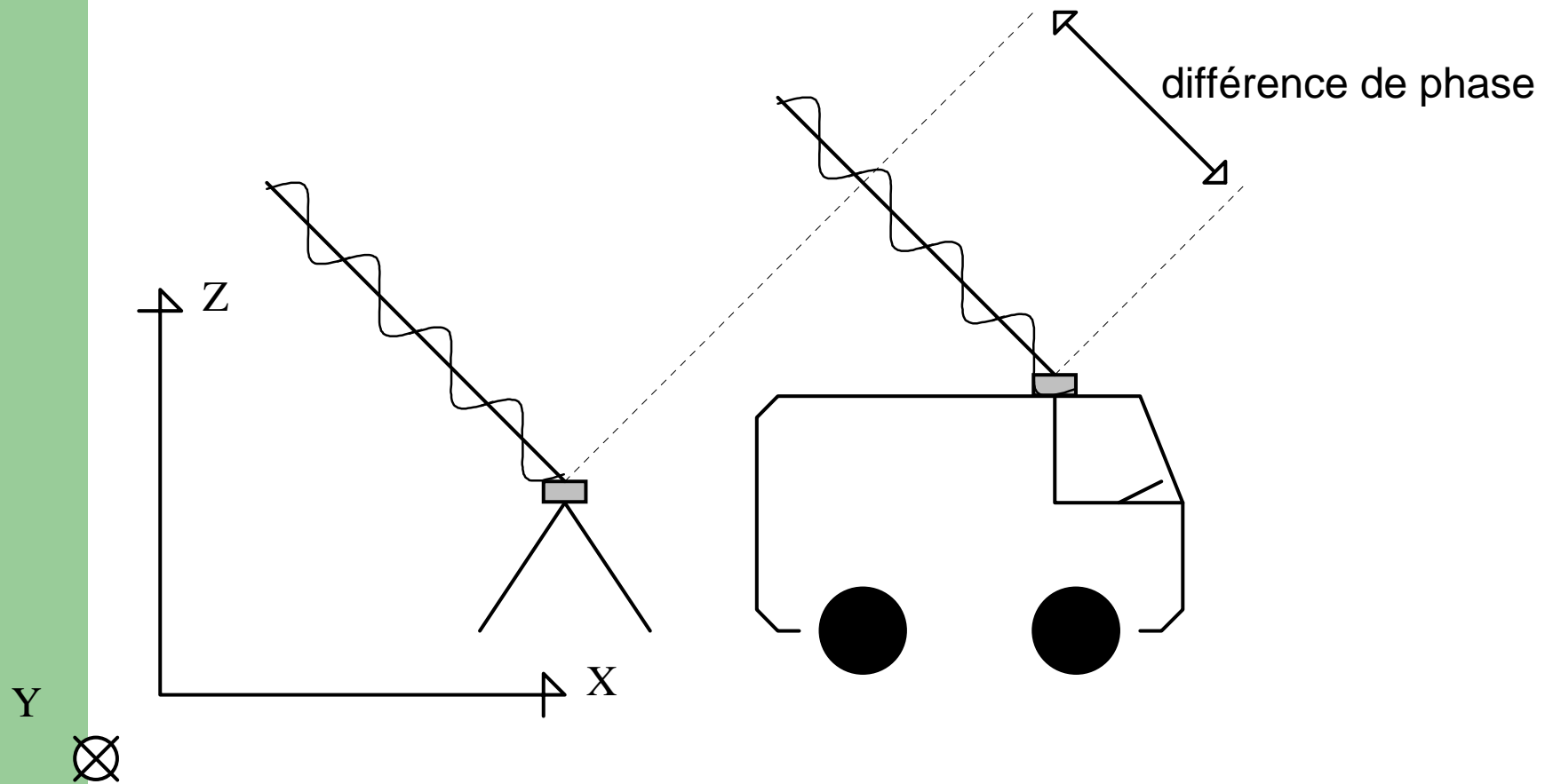
# Can GPS be more accurate?

**Yes!**  
**Kinematic GPS**  
**(in post-processing**  
**or in real-time)**  
**using the signal**  
**carrier phase**





# Interferometry bw base and rover



# GPS positioning / phase (1)

## Observation equation and position of the problem

$$\lambda\phi^j = R^j + \lambda N^j \quad (3) \quad (\lambda: \text{wave length} \sim 0.19 \text{ m})$$

- ◆  $\phi^j$ : measured carrier phase (from  $t_0$ )
- ◆  $N^j$ : integer ambiguity at  $t_0$  (invariant with time)
- ◆  $R^j$ : true geometric distance bw the receiver and the satellite  $j$ :  $R^j = \|\mathbf{s}^j - \mathbf{u}\|$

Note: one has not accurate enough models of the atmospheric delays to use carrier phase → so, one's own observations will be combined with other observations, synchronous, from another receiver relatively close, so that these delays (as well as satellites and receivers clock terms) be eliminated, and the other error sources are neglected (multipath, noise).

# GPS positioning / phase (2)

## Observation equation combining base and rover

$$\lambda\phi_m^j = R_m^j + \lambda N_m^j \quad \text{(jm)} \quad \text{(at the rover, for every satellite j)}$$

$$\lambda\phi_m^p = R_m^p + \lambda N_m^p \quad \text{(pm)} \quad \text{(at the rover, for the "pivot" sat.)}$$

$$\lambda\phi_b^j = R_b^j + \lambda N_b^j \quad \text{(jb)} \quad \text{(at the base, for every satellite j)}$$

$$\lambda\phi_b^p = R_b^p + \lambda N_b^p \quad \text{(pb)} \quad \text{(at the base, for the "pivot" sat.)}$$

$$\lambda DD\phi^j = DDR^j + \lambda DDN^j \quad \text{(4)} \quad \text{(for every satellite } j \neq p)$$

◆ DD : combination of the observations (jm-pm)-(jb-pb)

◆ p : pivot (in general, the highest satellite)

This combination is named a double difference.

# GPS positioning / phase (3)

## Equation in DD and position of the problem

If there are  $N (>1)$  satellites, there are  $(N-1)$  DD of unknown ambiguities, plus 3 unknown rover coordinates (the base coordinates are known), but only  $(N-1)$  equations → several « epochs » are required.

A multi-epoch system has to be solved with  $(N-1) \cdot \text{nbep}$  equations and  $(N-1)+3$  unknown:  $x_u, y_u, z_u$ , if the rover does not change its position from one epoch to the next.

With  $N$  satellites, the problem is solved if:  $\text{nbep} > 1+3/(N-1)$ .

$$\lambda \text{DD} \phi^{j \neq \text{pivot}} = f^{j \neq \text{pivot}}(x_u, y_u, z_u) + \lambda \text{DD} N^{j \neq \text{pivot}} \quad (5)$$

# GPS positioning / phase (4)

## If the rover changes its position...

A multi-epoch system has to be solved with  $(N-1) \cdot nbep$  equations and  $(N-1) + 3 \cdot nbep$  unknown:  $x_u, y_u, z_u$ , variable with time if the rover changes its position from one epoch to the next.

The problem is solved if:  $(N-1) \cdot nbep > (N-1) + 3 \cdot nbep$ .

From this inequality, one shows that  $N > 1 + 3 \cdot nbep / (nbep - 1)$ .

This is known as fixing ambiguities “On The Fly”: 5 satellites minimum are required.

# Linearization and fixing ambiguities

- For k epochs, next matrix equation is obtained:

$$\begin{bmatrix} \Delta\rho_{1(k1)} \\ \dots \\ \Delta\rho_{N-1(k1)} \\ \dots \\ \Delta\rho_{1(kep)} \\ \dots \\ \Delta\rho_{N-1(kep)} \end{bmatrix} = \begin{bmatrix} a_{x1(k1)} & a_{y1(k1)} & a_{z1(k1)} & \lambda & 0 & 0 \\ \dots & \dots & \dots & \dots & \dots & \dots \\ a_{x1(k1)} & a_{y1(k1)} & a_{z1(k1)} & 0 & 0 & \lambda \\ \dots & \dots & \dots & \dots & \dots & \dots \\ a_{x1(kep)} & a_{y1(kep)} & a_{z1(kep)} & \lambda & 0 & 0 \\ \dots & \dots & \dots & \dots & \dots & \dots \\ a_{x1(kep)} & a_{y1(kep)} & a_{z1(kep)} & 0 & 0 & \lambda \end{bmatrix} \begin{bmatrix} \Delta x_u \\ \Delta y_u \\ \Delta z_u \\ DDN_1 \\ \dots \\ DDN_{N-1} \end{bmatrix}$$

$$\Delta\rho = \mathbf{H} [\Delta x_u, \Delta y_u, \Delta z_u, DDN_1, \dots, DDN_{N-1}]' = \mathbf{A} \Delta\mathbf{x} + \mathbf{G} \mathbf{n} \quad (6)$$

whose 2nd bloc will be solved in real then in integer spaces

# Linearization and fixing ambiguities

- Complex problem (linearized equations under constraints)
- Float solution (dm accurate) while solving both the position and the ambiguities in real space
- Fix solution (cm accurate) with the ambiguities constrained in integer space
- Once the ambiguities fixed, the system (6) is solved iteratively until convergence: the final accuracy gets sub-cm with fixed ambiguities, and this works until distances bw base and rover of tens of km in double difference

$$\Delta\rho - \mathbf{G} \mathbf{n} = \mathbf{A} [\Delta\mathbf{x}_u, \Delta\mathbf{y}_u, \Delta\mathbf{z}_u] \quad (7)$$

# Further reading...

- **“GPS localisation et navigation par satellites”, F. Duquenne, S. Botton, F. Peyret, D. Bétaille, P. Willis, édition Hermès Lavoisier, 2005.**
- “GPS for geodesy”, by P.J.G. Teunissen and A. Kleusberg, published by Springer, 1996.
- Web sites of: Trimble, Leica, Novatel, Thales, Javad, etc...
- Revue GPS world
- Proceedings of IEEE ION conferences