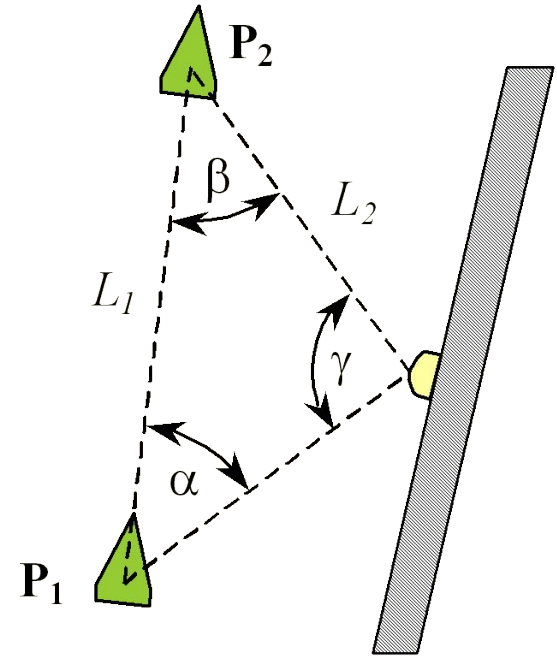

Robótica Móvel

— Robot Localization - Part 2 —

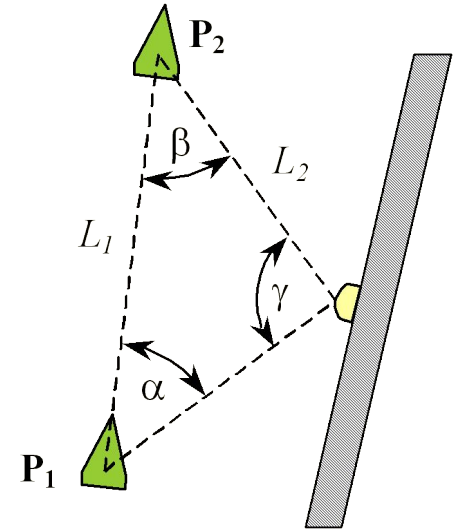
1-Extract position from motion-based triangulation

- Consider a beacon in a wall with coordinates $B=(0,5)$ (in meters)
- Consider a differential drive robot with initial position at $P_1=(2,0,50^\circ)$.
- Consider the robot kinematics to be the following:
 - $x(n+1)=x(n)+V*\Delta t*\cos(\theta(n))$
 - $y(n+1)=y(n)+V*\Delta t*\sin(\theta(n))$
 - $\theta(n+1)=\theta(n)+\omega*\Delta t$
- Where $V=2$ m/s, $\omega=0$, $\Delta t=0.2$ s, during 5 seconds.
- The goal is to simulate the robot motion by calculating the position at each iteration (after $t=0.2$) both by odometry and triangulation.
 - Odometry: use $(x(n), y(n))$ to plot position
 - Triangulation: use $(L_2(n), \beta(n))$ to obtain $(x(n), y(n))$ and plot it
- Follow instructions on next pages



1a-Create beacon heading function

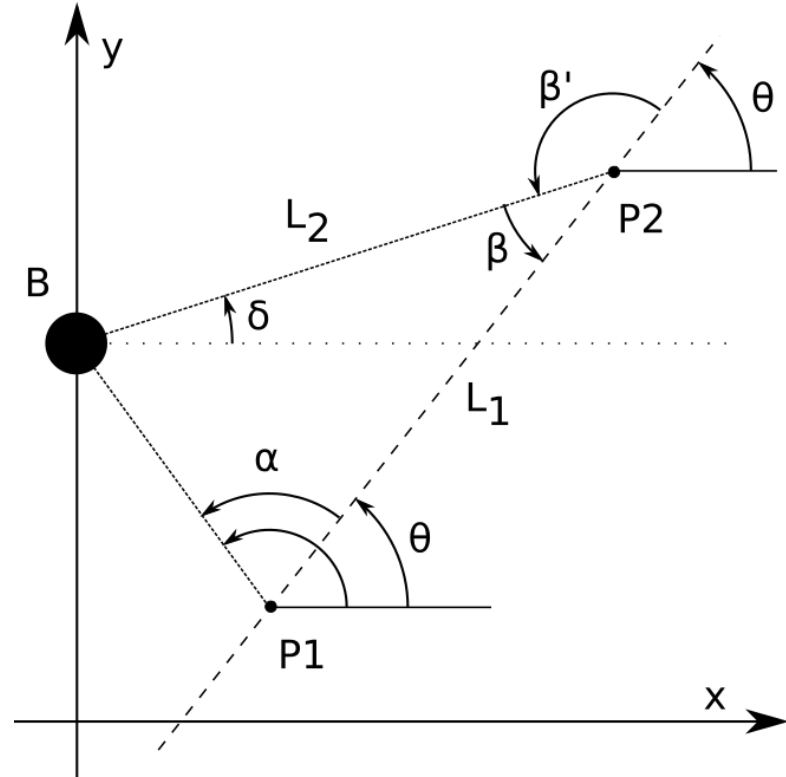
- Create the function **getbdir()** to simulate the detection of the beacon heading:
 - Accepts beacon position B, the current point P and θ .
 - Returns the angle defined by $\angle B, P, Q$ where Q is a point along the path. This angle must be $< 180^\circ$!
- function `a=getbdir(B,P,th)`
 - B - beacon coordinates
 - P - current position in path
 - th - direction of motion in the global frame
 - a - angle $\angle B, P, Q \bmod 180^\circ$
- The function is expected to return the angle α
 - If the caller needs the β angle, an extra operation is required as explained next.



1b-Auxiliary elements to calculate angles and lines

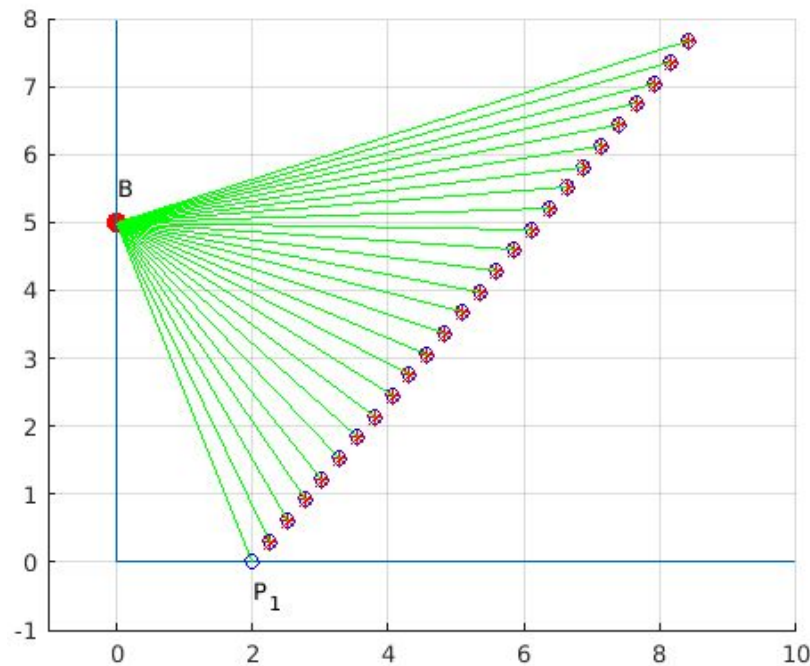
- Angle α should be obtained for initial position P1
- Angle β is obtained on subsequent calls, but what is returned is not β but β' . So, an extra operation is required :-)
- To simulate the calculation of the localization, the value of L_2 is to be used along with angle δ , so δ must be obtained after other angles.

$$L_2 = L_1 \frac{\sin \alpha}{\sin (\alpha + \beta)}$$



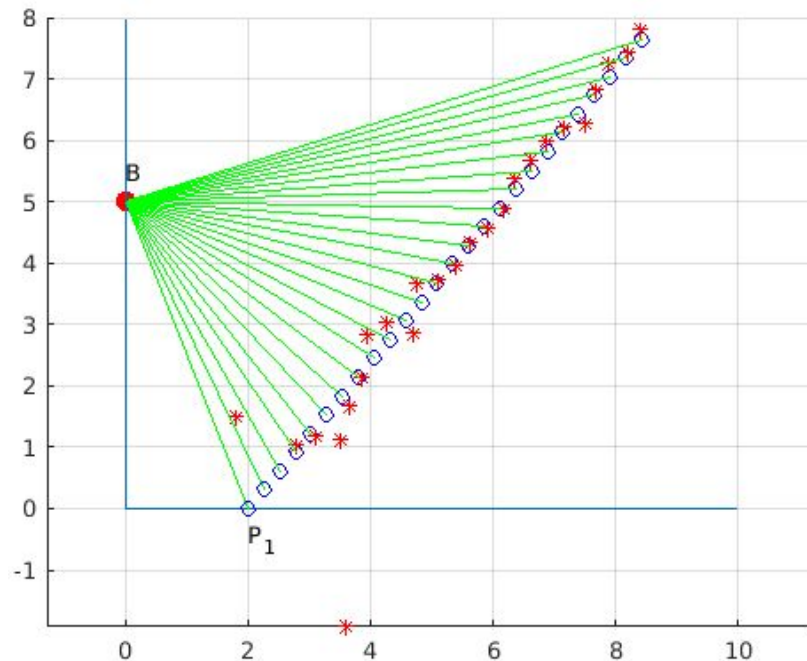
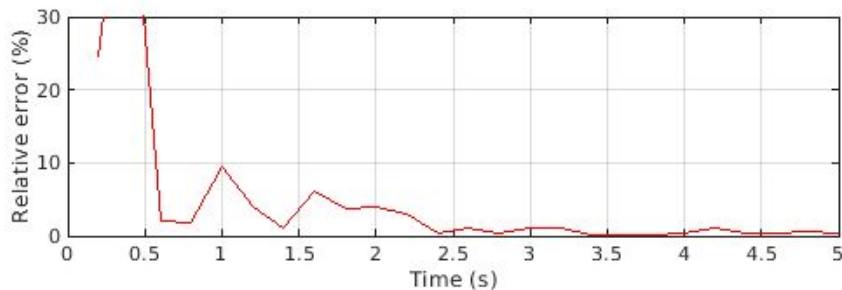
1c - Confirm the localization calculation

- Plot both the:
 - odometry (blue circle)
 - and the localization results (red asterisk)
- Both marks should coincide.
- There is no localization for initial position because no motion has yet occurred
- You can also draw the lines connecting each position to the beacon...



1d - Simulate uncertainty in the heading measurement

- Adjust the **getbdir()** function to introduce a gaussian error with zero mean and $\sigma=0.0175$ rad ($\sim 1^\circ$)
- Plot the localization result in that circumstance.
- Plot also the relative errors of distances to the beacon along the path:
 - It is clear that the error decreases as path length increases



2- Localization with 2 beacons - using heading

- Using the symbolic representation in Matlab (install the Symbolic Toolbox if needed) , establish the analytical solution for the 2 beacon localization problem defined by the next equation:

$$\begin{bmatrix} -\sin \theta_1 & \cos \theta_1 \\ -\sin \theta_2 & \cos \theta_2 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} -x_1 \sin \theta_1 + y_1 \cos \theta_1 \\ -x_2 \sin \theta_2 + y_2 \cos \theta_2 \end{bmatrix}$$

- Hints: create the symbolic variables
 - `syms th1 th2 x y x1 y1 x2 y2 real`
 - The 'real' modifier after the variables limits solutions to real quantities!
- Express the solution $P=[x \ y]^T$, as the inverse of the leftmost matrix multiplied by the matrix on the right above.

2a - Confirm the results

- Apply the “**simplify**” operation and after using the “**pretty(P)**” command, verify the symbolic result obtained.
- You can also generate a LaTeX encoding of the equation with:
 - **latex(P)**
- Select the resulting LaTeX string and render it in an online service <https://quicklatex.com/> and check the final result:

```
/      cos(th1) #1      cos(th2) #2  \
| ----- - ----- |
| sin(th1 - th2)      sin(th1 - th2) |
|                                     |
|      sin(th1) #1      sin(th2) #2  |
| ----- - ----- |
\ sin(th1 - th2)      sin(th1 - th2) /
```

where

```
#1 == y2 cos(th2) - x2 sin(th2)
#2 == y1 cos(th1) - x1 sin(th1)
```

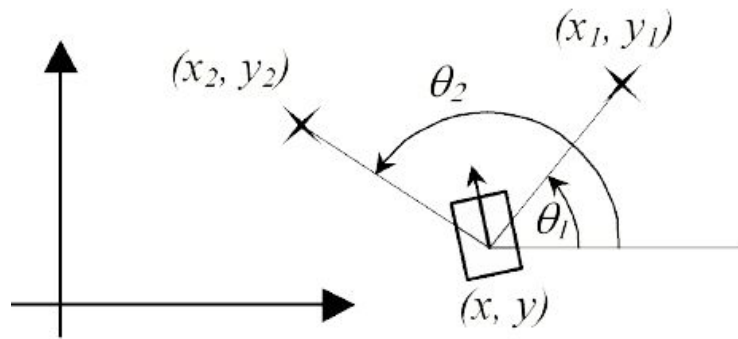
$$\left(\frac{\cos(\text{th}_1) (y_2 \cos(\text{th}_2) - x_2 \sin(\text{th}_2))}{\sin(\text{th}_1 - \text{th}_2)} - \frac{\cos(\text{th}_2) (y_1 \cos(\text{th}_1) - x_1 \sin(\text{th}_1))}{\sin(\text{th}_1 - \text{th}_2)} \right)$$

$$\frac{\sin(\text{th}_1) (y_2 \cos(\text{th}_2) - x_2 \sin(\text{th}_2))}{\sin(\text{th}_1 - \text{th}_2)} - \frac{\sin(\text{th}_2) (y_1 \cos(\text{th}_1) - x_1 \sin(\text{th}_1))}{\sin(\text{th}_1 - \text{th}_2)}$$

- For more pleasant results you can replace the variable ‘th’ by ‘theta’ in the matlab program and the corresponding greek letter would be rendered in LaTeX!

2b - Confirm the solution with a concrete example

- Consider 2 beacons at the following points:
 - $B1=[10; 6];$ % x1,y1
 - $B2=[5; 5];$ % x2,y2
- And the test point
 - $P=[8;2];$ %x, y
- Define θ_1 and θ_2 after and B1, B2 and P (use **atan2()** function)
- Apply the symbolic solution calculated before to these values, and confirm the result as being the point P defined above!
 - See next slide for instructions on how to convert symbolic to numeric values



2c - Procedure to instantiate symbolic expressions

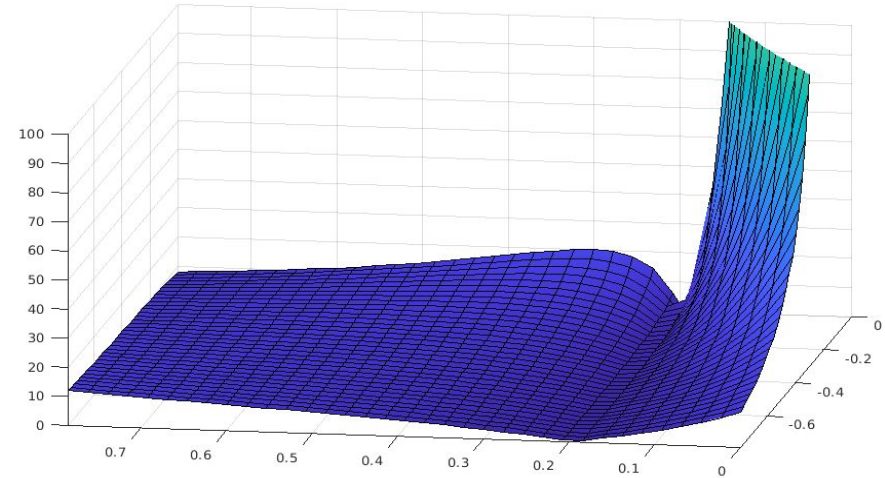
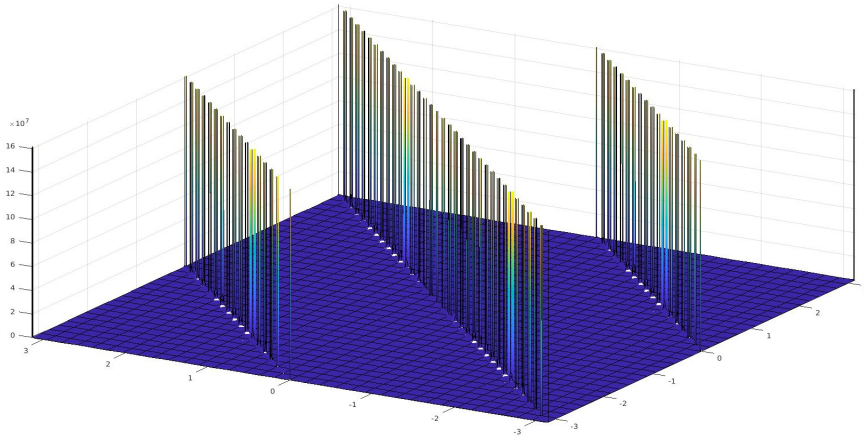
- Define the numeric values for all the variables involved.
- In this case we have:
 - `th1=... %complete with the simulate measurement for th1`
 - `th2=... %complete with the simulate measurement for th2`
 - `x1=B1(1);`
 - `y1=B1(2);`
 - `x2=B2(1);`
 - `y2=B2(2);`
- `Pf=subs(P)` % generates a numeric value, but with too much precision!
- `Pf=vpa(subs(P),3)` % forces a limited precision to 3 decimal places.

3a-Uncertainty and GDOP for the 2 beacon problem

- Using the case from the previous exercise, establish the analytical formulation of the Jacobian for the localization function.
- The functions are $[x \ y]$ and the variables $[th1 \ th2]$. Use the matlab **jacobian()** function for the operation.
- Verify that for an uncertainty of $d\theta=[0.1 \ 0.1]^T$ the uncertainty in the localization for the beacons and position involved is approximately $dr=[0.53 \ 0.07]^T$
- Verify that the GDOP for this position and these beacons is approximately
 - GDOP ~ 20.0

3b - GDOP for a wide range of angles

Plot the GDOP for these intervals of angles: $[-180^\circ \ 180^\circ] \times [-180^\circ \ 180^\circ]$ and $[-45^\circ \ 0] \times [0 \ 45^\circ]$



Whenever $\tan(\theta_1) = \tan(\theta_2)$, the uncertainty is unlimited!

4- Localization with n beacons using distances

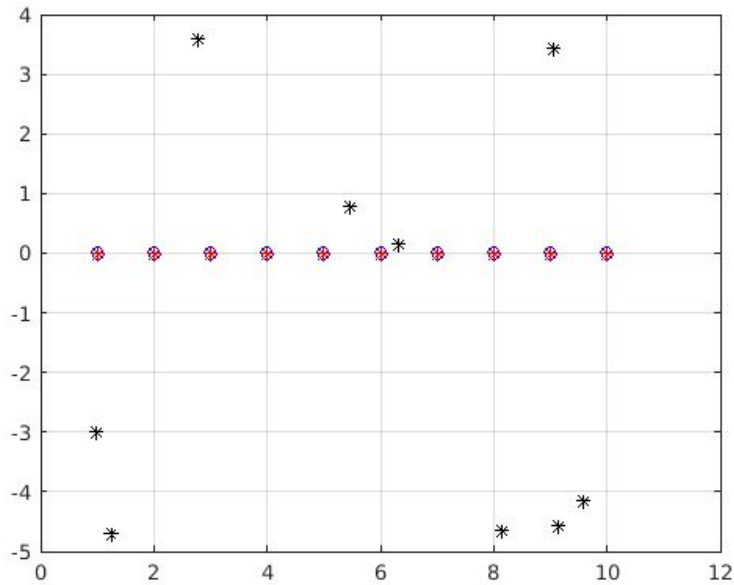
- Consider a setup with n beacons spread randomly in the plane within this region: [0 10] in x, and [-5 5] in y.
- Consider a robot moving from [0 0] to [10 0]
- Plot the calculated localization of the robot along the path

$$\mathbf{X} = \mathbf{A}^+ \cdot \mathbf{B} = (\mathbf{A}^\top \cdot \mathbf{A})^{-1} \mathbf{A}^\top \cdot \mathbf{B}$$

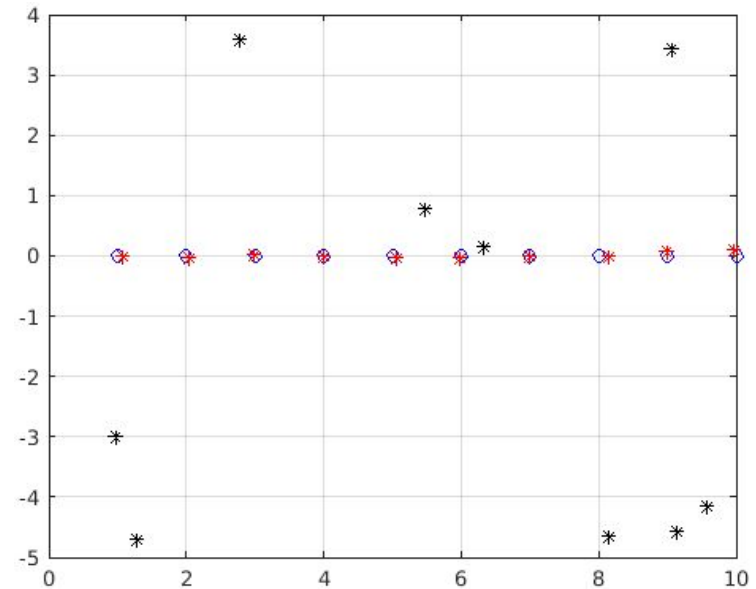
$$\mathbf{A} = \begin{bmatrix} 2(x_1 - x_2) & 2(y_1 - y_2) \\ 2(x_1 - x_3) & 2(y_1 - y_3) \\ \vdots & \vdots \\ 2(x_1 - x_n) & 2(y_1 - y_n) \end{bmatrix} \quad \mathbf{B} = \begin{bmatrix} d_2^2 - d_1^2 + x_1^2 - x_2^2 + y_1^2 - y_2^2 \\ d_3^2 - d_1^2 + x_1^2 - x_3^2 + y_1^2 - y_3^2 \\ \vdots \\ d_n^2 - d_1^2 + x_1^2 - x_n^2 + y_1^2 - y_n^2 \end{bmatrix}$$

4b-Illustration of cases with $n=9$, with and without noise

No noise in measurements



Gaussian noise with $\sigma=0.1$



rng(0) in both cases