



# VOR Base Stations for Indoor 802.11 Positioning

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# indoor positioning



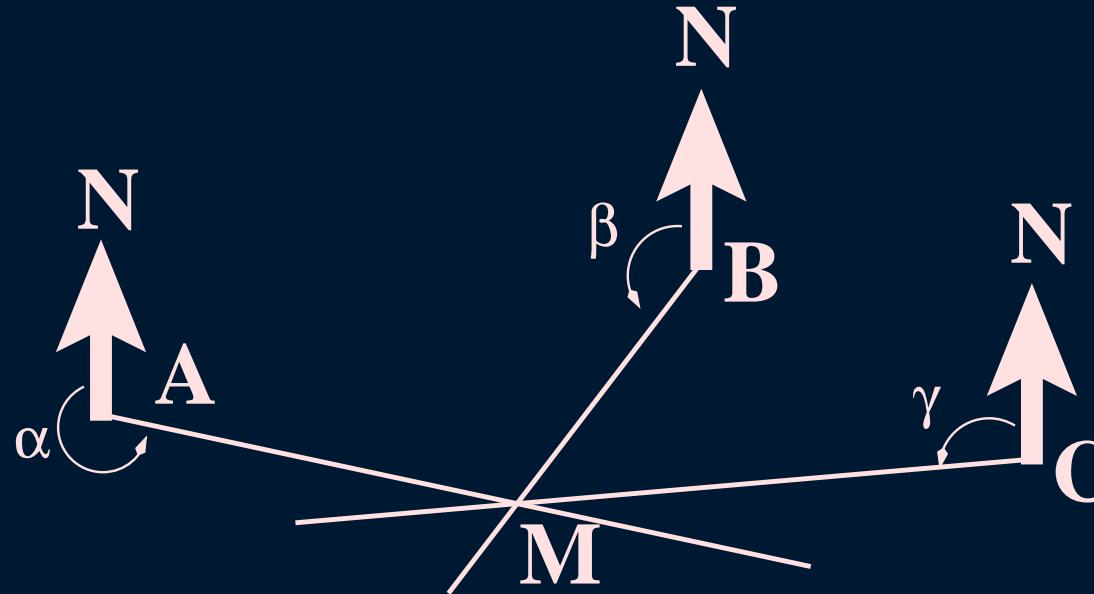
- **no GPS indoors!**
- **classifications of existing systems**
  - **infrastructure**
    - **existing 802.11 base stations**
    - **specialized beacons**
  - **measurement medium**
    - **RF (radio frequency)**
    - **infrared**
    - **ultrasound**
  - **actual positioning method**
    - **triangulation**
    - **trilateration**
    - **signal strength map**

# positioning basics



1. **range based - trilateration**
2. **angle based - triangulation**
3. **signal strength map - nearest neighbor, Bayes**

# trilateration



$$(x_M - x_A)^2 + (y_M - y_A)^2 = MA^2$$

$$(x_M - x_B)^2 + (y_M - y_B)^2 = MB^2$$

$$(x_M - x_C)^2 + (y_M - y_C)^2 = MC^2$$

**solve for  $(x_M, y_M)$**

- $MA, MB, MC$  **are affected by errors**
- **several methods available**

# example: Cricket (MIT)



## ○ mobile

- measures ranges to ceiling beacons
  - TDOA between RF and ultrasound
- triangulates

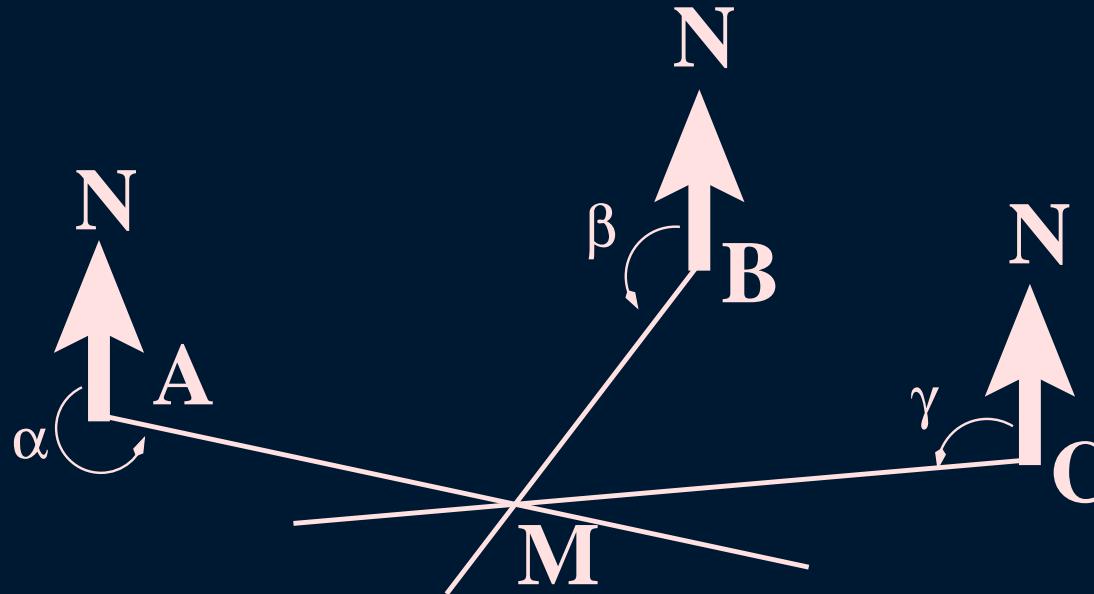
## ○ pros:

- good accuracy 1.3m

## ○ cons:

- extensive **infrastructure**
- line of sight to the beacons

# triangulation



$$(x_M - x_A) \sin \alpha = (y_M - y_A) \cos \alpha$$

$$(x_M - x_B) \sin \beta = (y_M - y_B) \cos \beta$$

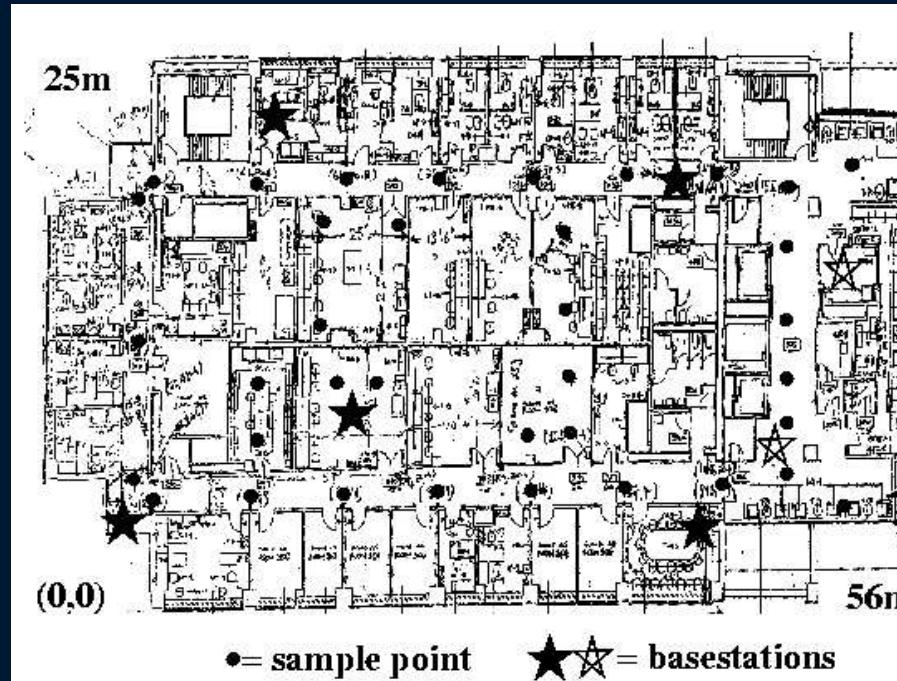
$$(x_M - x_C) \sin \gamma = (y_M - y_C) \cos \gamma$$

**solve for  $(x_M, y_M)$**

- $\alpha, \beta, \gamma$  -affected by errors (Gaussian)
- several methods available



# signal strength map



- build SS map:
  - for each point, measure SS to all 5 BS
- query:
  - measure SS to 5 BS  $\Rightarrow$  best match in the map

# example: RADAR (Microsoft)



- **use nearest neighbor to decide for the best match**
- **pros:**
  - **no additional infrastructure**
- **cons:**
  - **requires high resolution sampling**
  - **people, furniture, BS position affect the SS map**
- **median position error 3m**

# example: LANDMARC (MSU)



- **replaces**
  - **training points with RFID tags**
  - **BS with RFID readers**
- **mobile uses an RFID tag → nearest neighbor, etc.**
- **pros:**
  - **no remapping** → updates map on the fly
- **cons:**
  - **additional infrastructure (RFID)**
  - **many readers, tags**



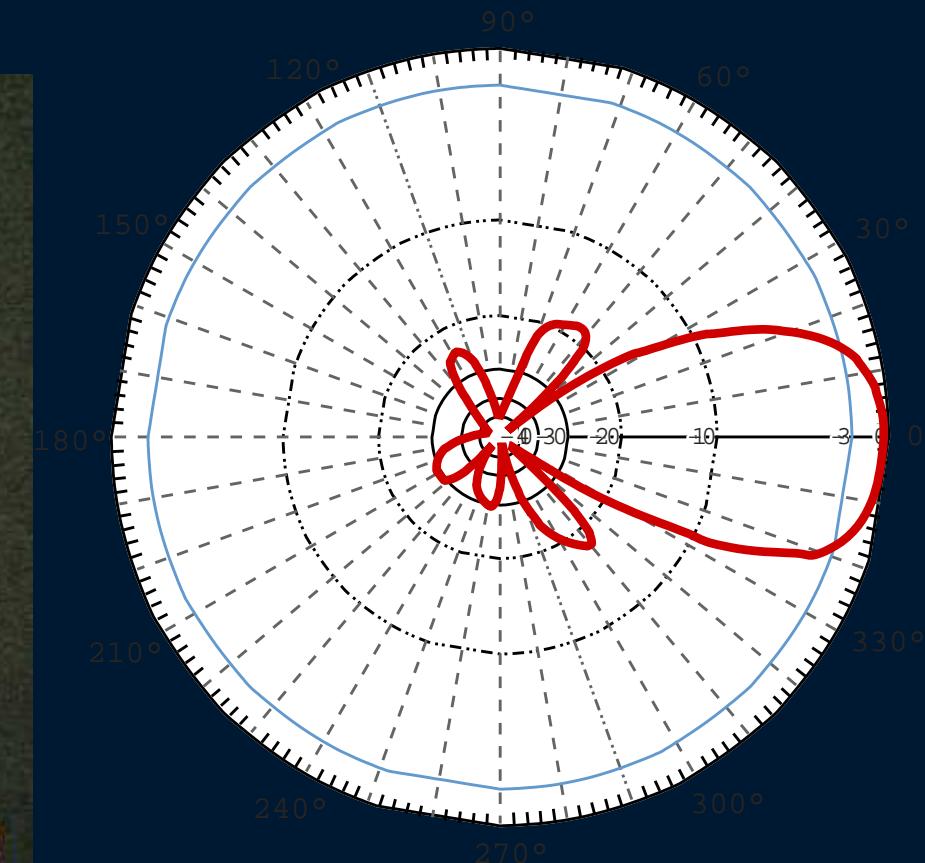
## goals:

- no signal strength map
- less infrastructure
- move complexity to the 802.11 base station
- use:
  - angles
  - ranges
  - angles and ranges

# VORBA prototype

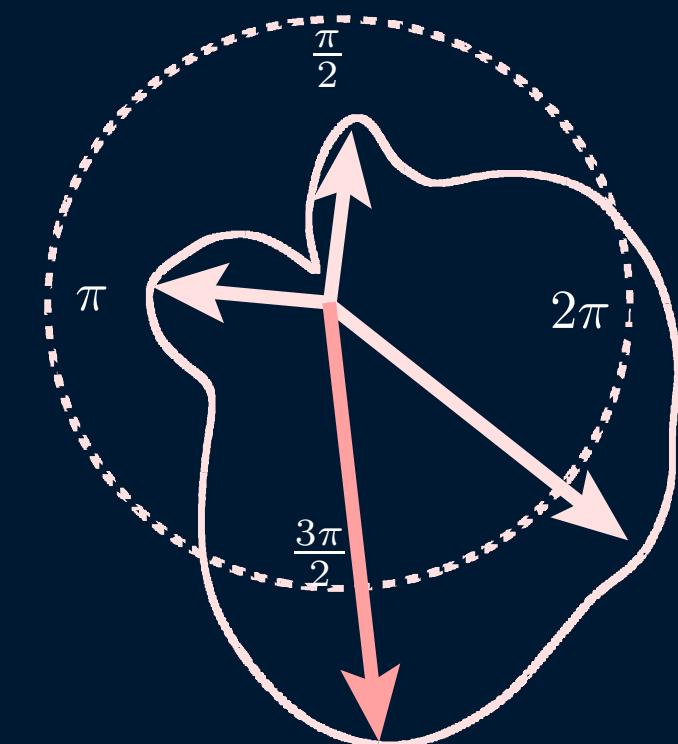
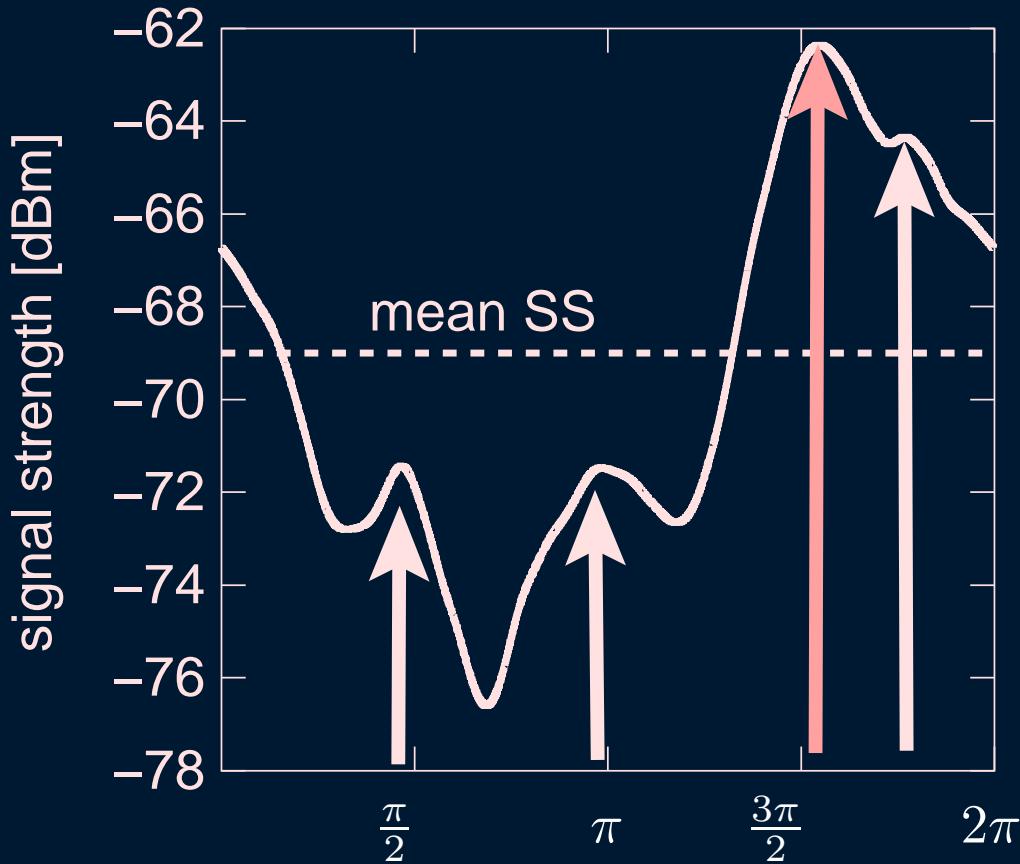


prototype



directional antenna pattern

# basic measurements

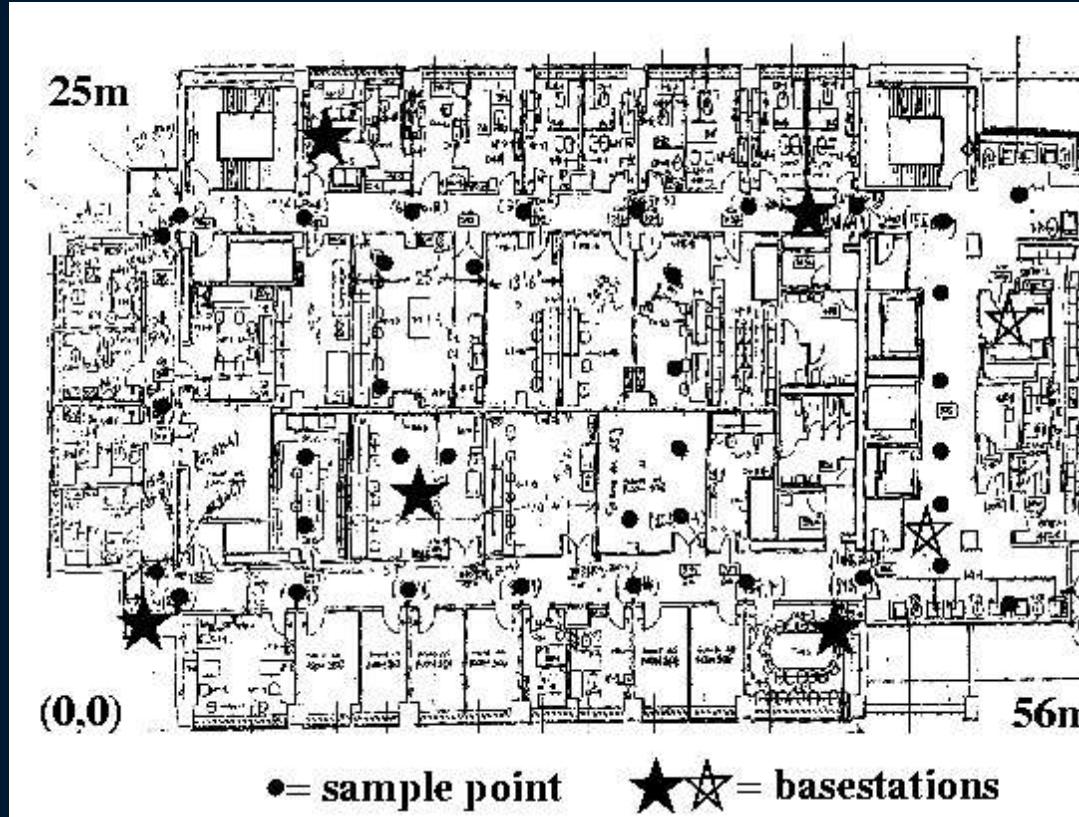


- **discrete angles**
- **angle distribution**
- **range**

$$SS(\alpha)$$

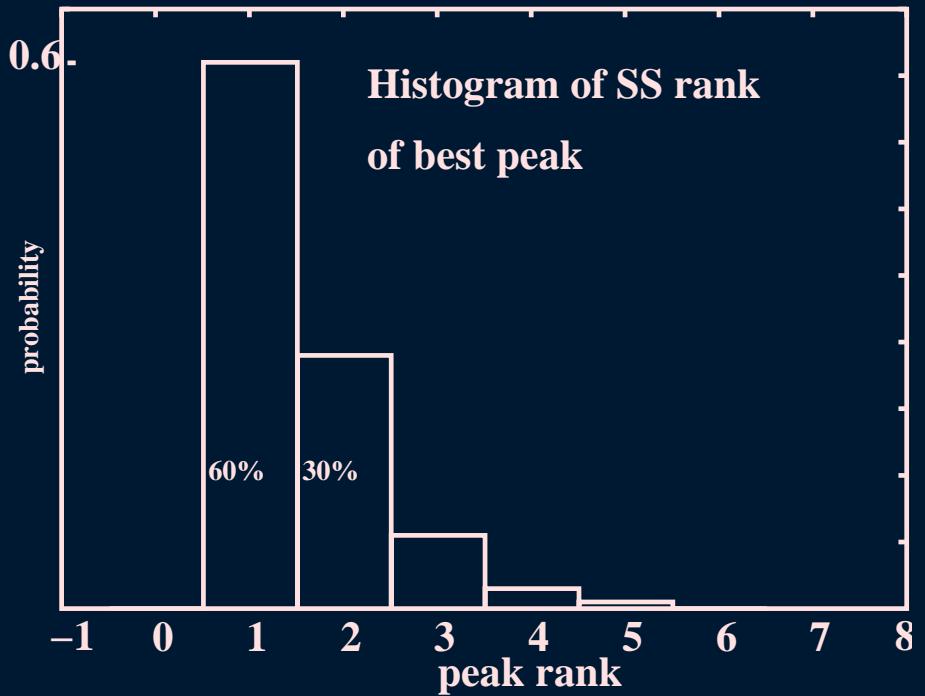
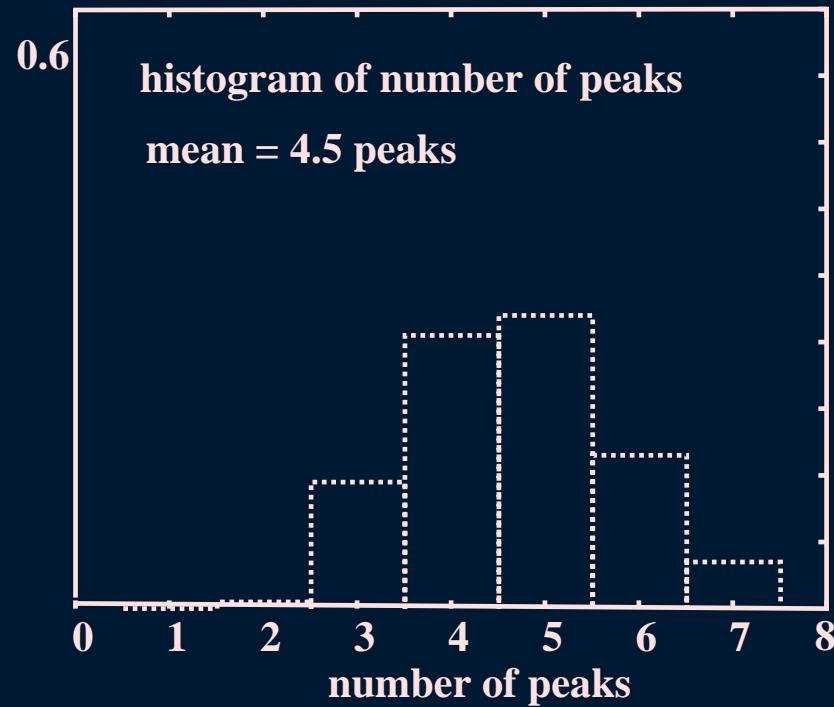


# experiments



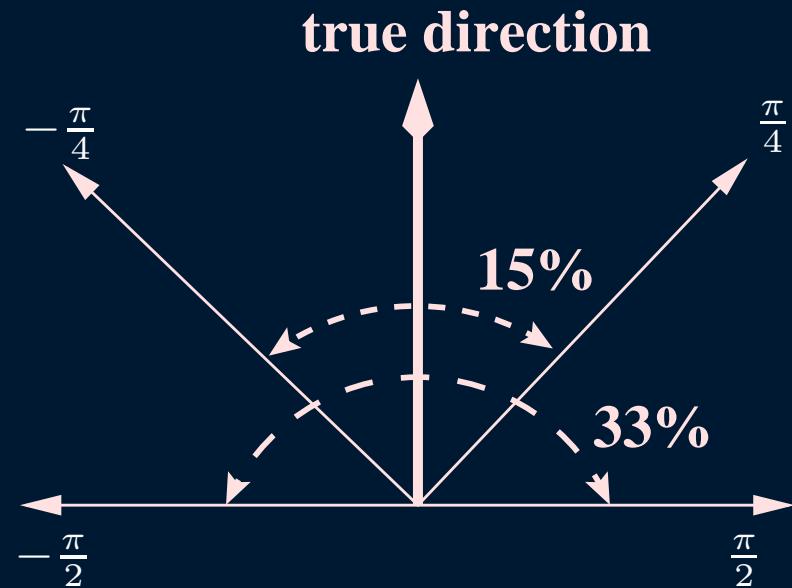
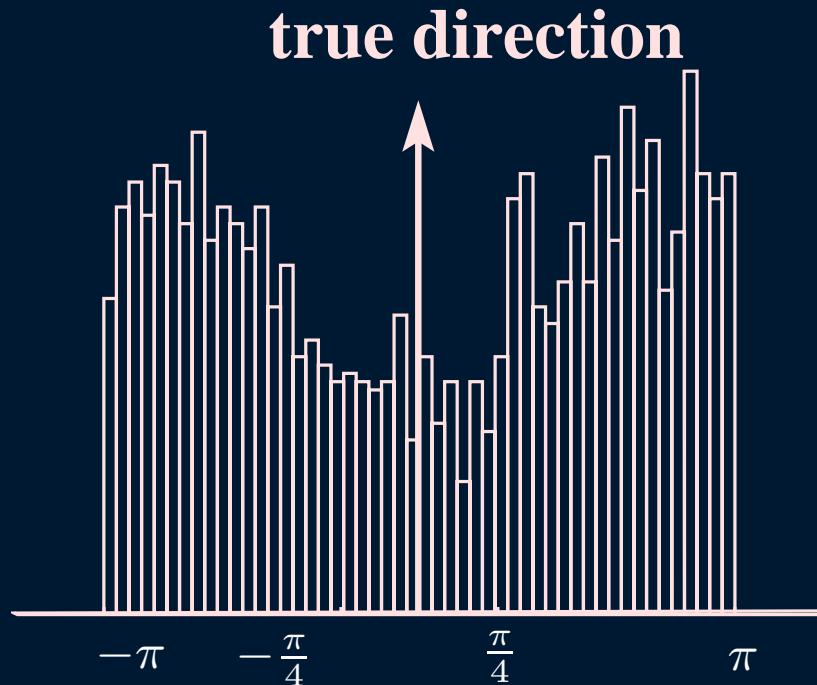
- **32 measurement points**
- **5 + 2 base stations**
- **N/E/S/W measurements of 3-4 revolutions each**

# best peak distribution



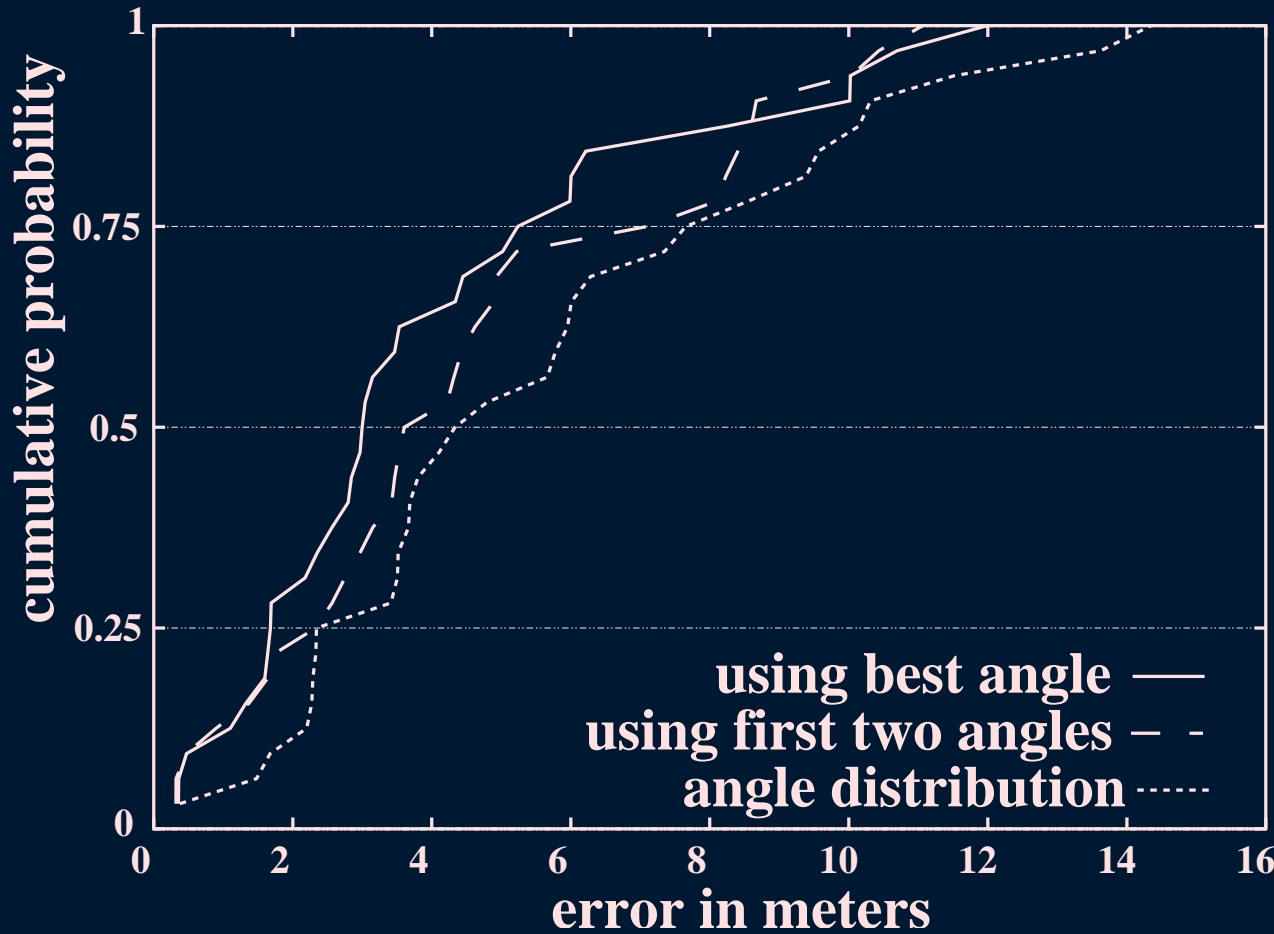
- 4.5 peaks on average
- best peak is first/second 90% of the time

# other peak distribution



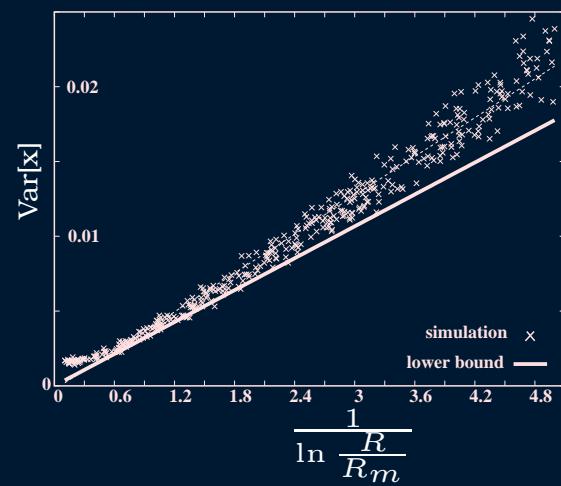
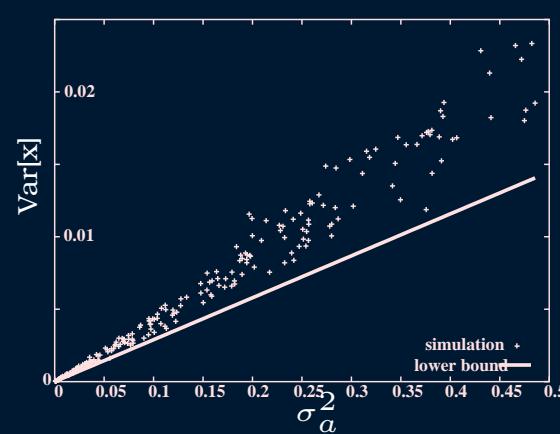
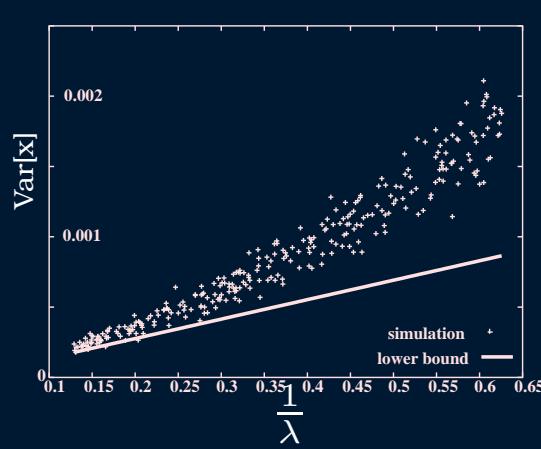
- other peaks point away from true direction

# discrete angle positioning



- **3.5m median position error**
- **3m if we knew the best peak**

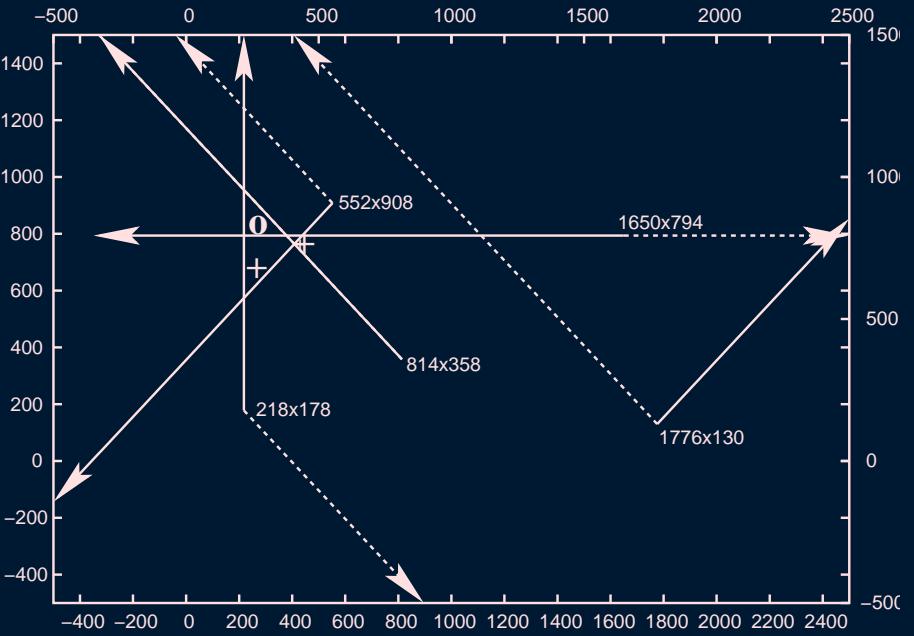
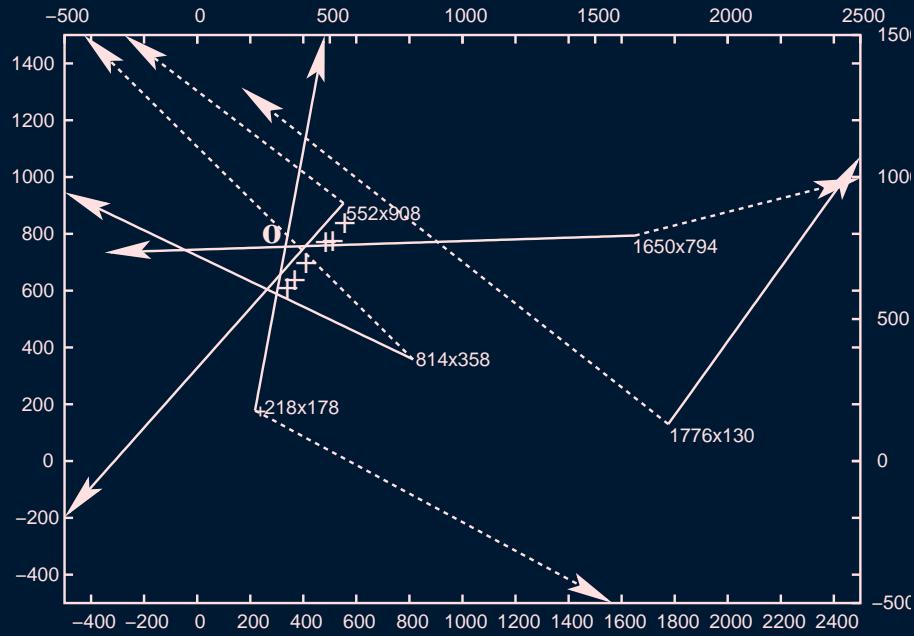
# triangulation analysis



$$\text{Var}[x] > \frac{\sigma_a^2}{\lambda \pi \ln \frac{R}{R_m}}$$

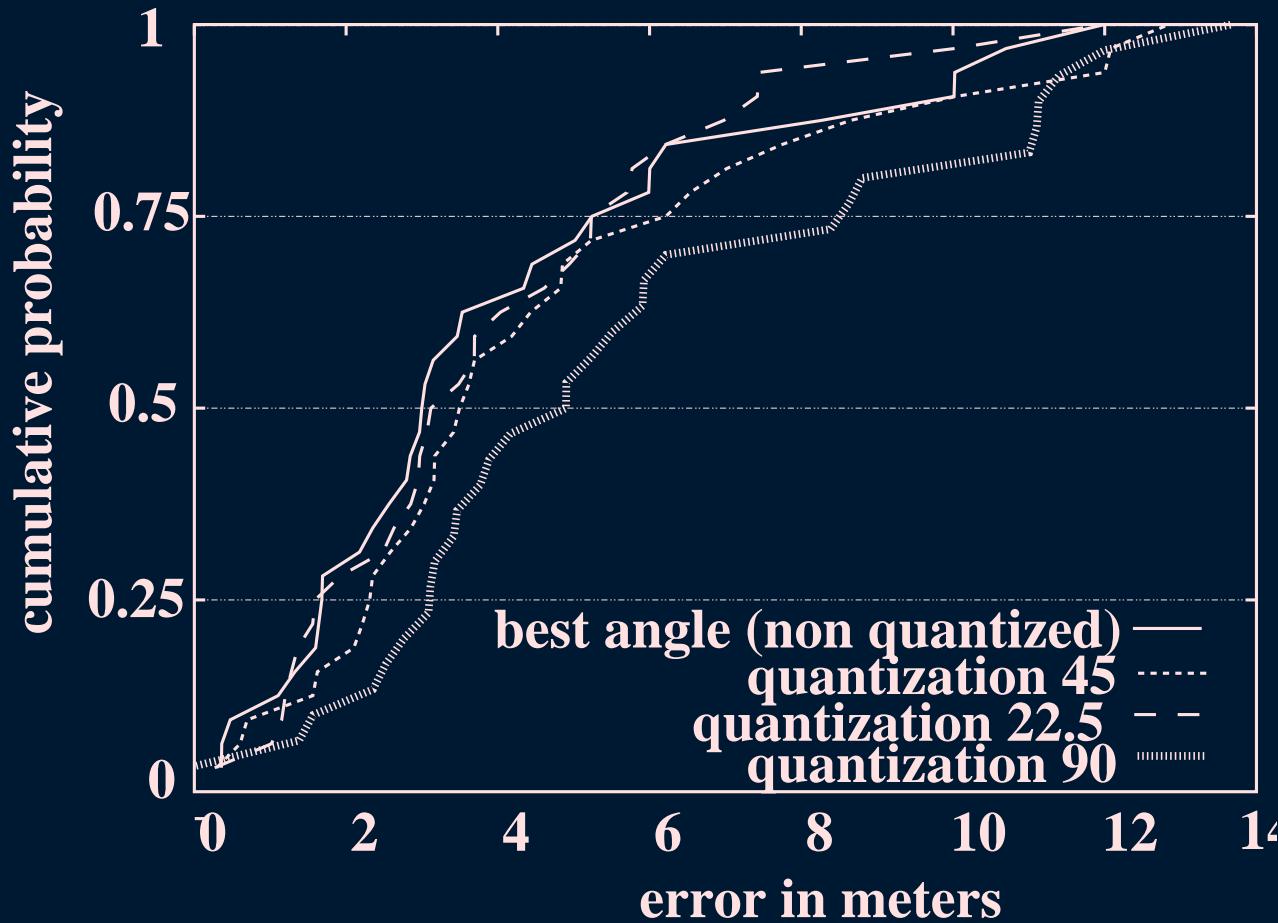
- $\text{Var}[x]$  - standard dev. of positioning error
- $\lambda$  - density of basestations /  $m^2$
- to improve positioning:
  1. decrease measurement error  $\sigma_a$
  2. use more basestations

# quantized angles



- measurements rounded to the nearest  $45^\circ$
- simulation

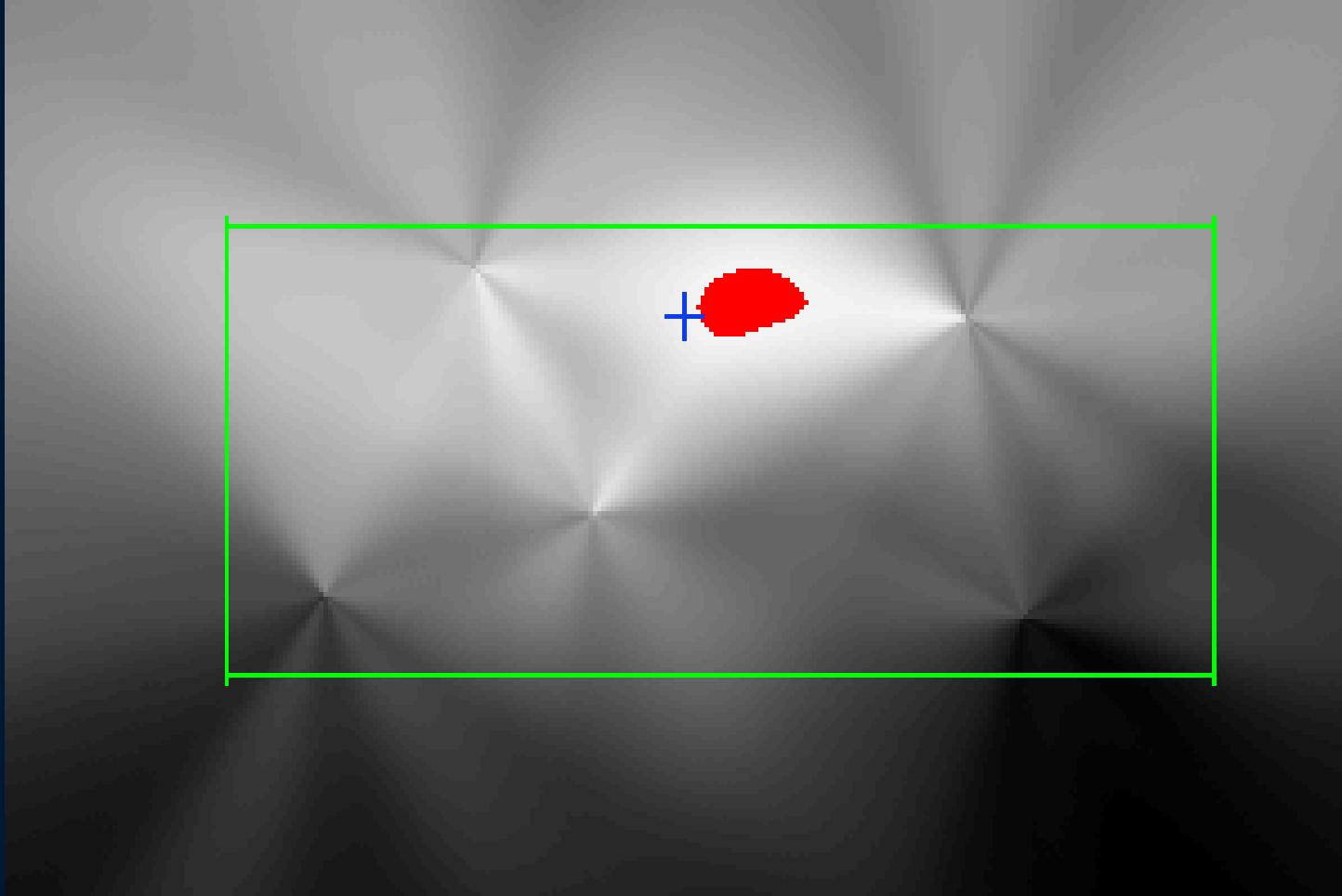
# quantized angles



- little degradation for

- 16 directions ( $22.5^\circ$ )
  - 8 directions ( $45^\circ$ )

# angle distribution



# range inference

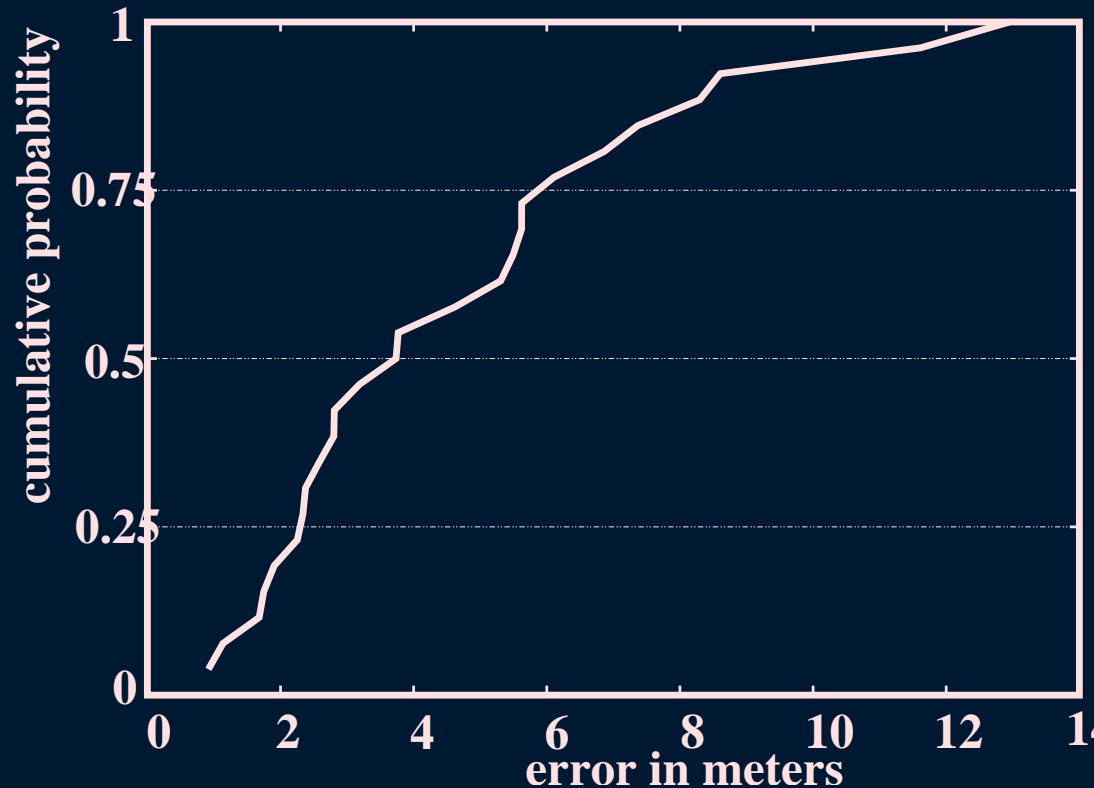


- **open space attenuation:**

$$SS[dBm] = SS_0[dBm] - \log_{10}(\frac{d}{d_0})^n$$

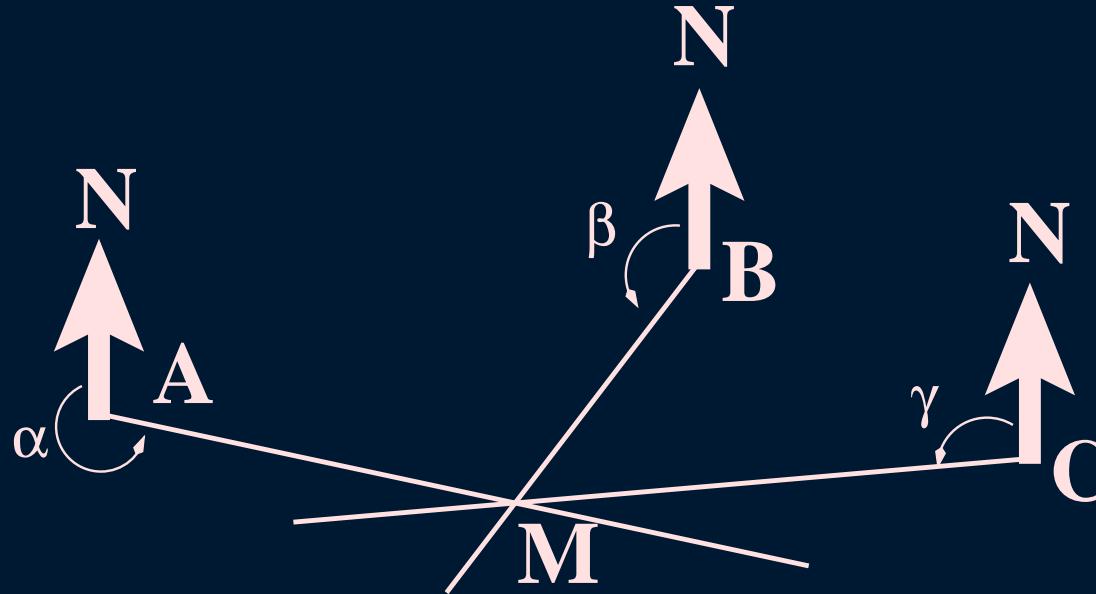
- $d(SS)$ 
  - obtained through fitting
  - known to be unreliable
- we obtain it from integration of  $SS(\alpha)$
- 5-fold cross validation
  - corridor basestations - waveguide effect
  - median range error 2.8m

# positioning w. ranges



- trilateration 5 base stations
- median position error 4.5m

# ranges and angles

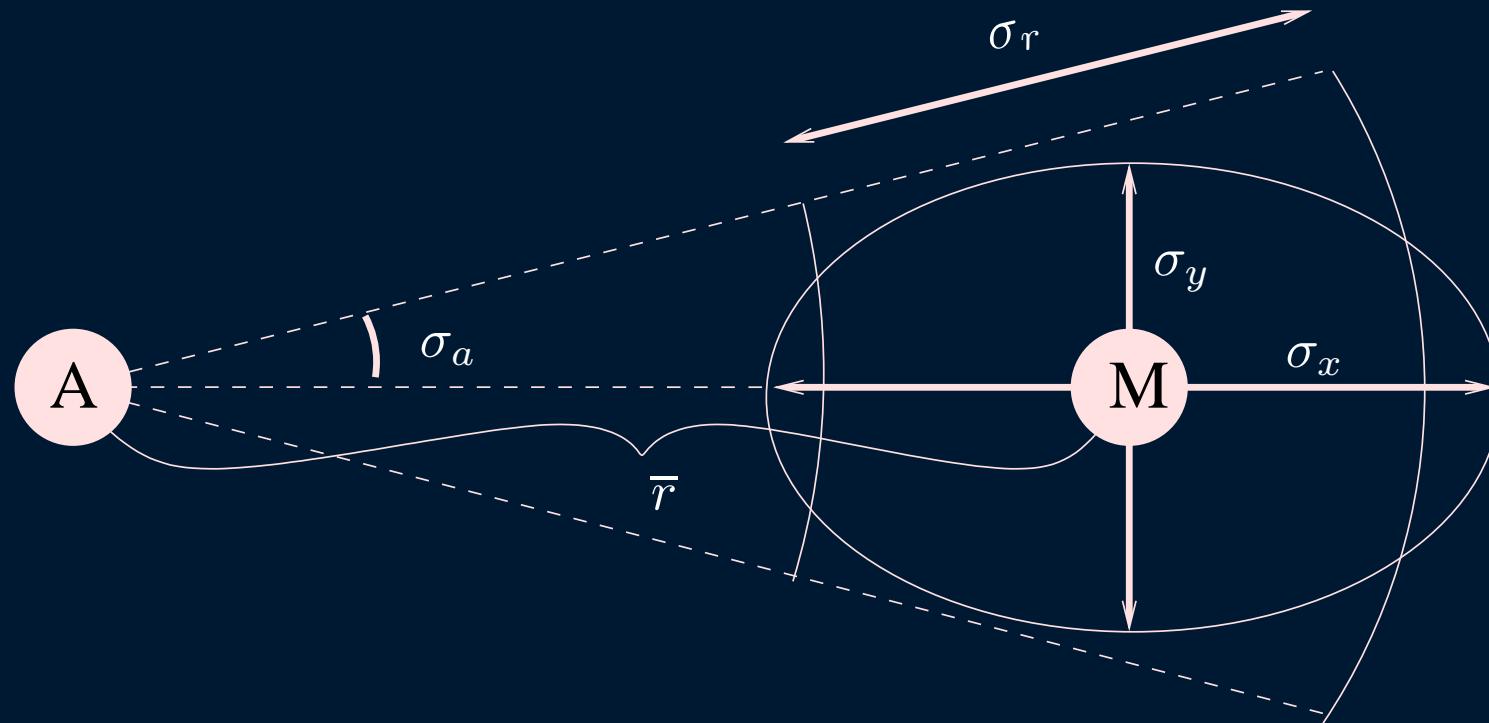


$$x_M = x_A + MA \cos \alpha = x_B + MB \cos \beta = x_C + MC \cos \gamma$$

$$y_M = y_A + MA \sin \alpha = y_B + MB \sin \beta = y_C + MC \sin \gamma$$

- **one base station is theoretically enough**
- $\alpha, \beta, \gamma, MA, MB, MC$  - **affected by errors**

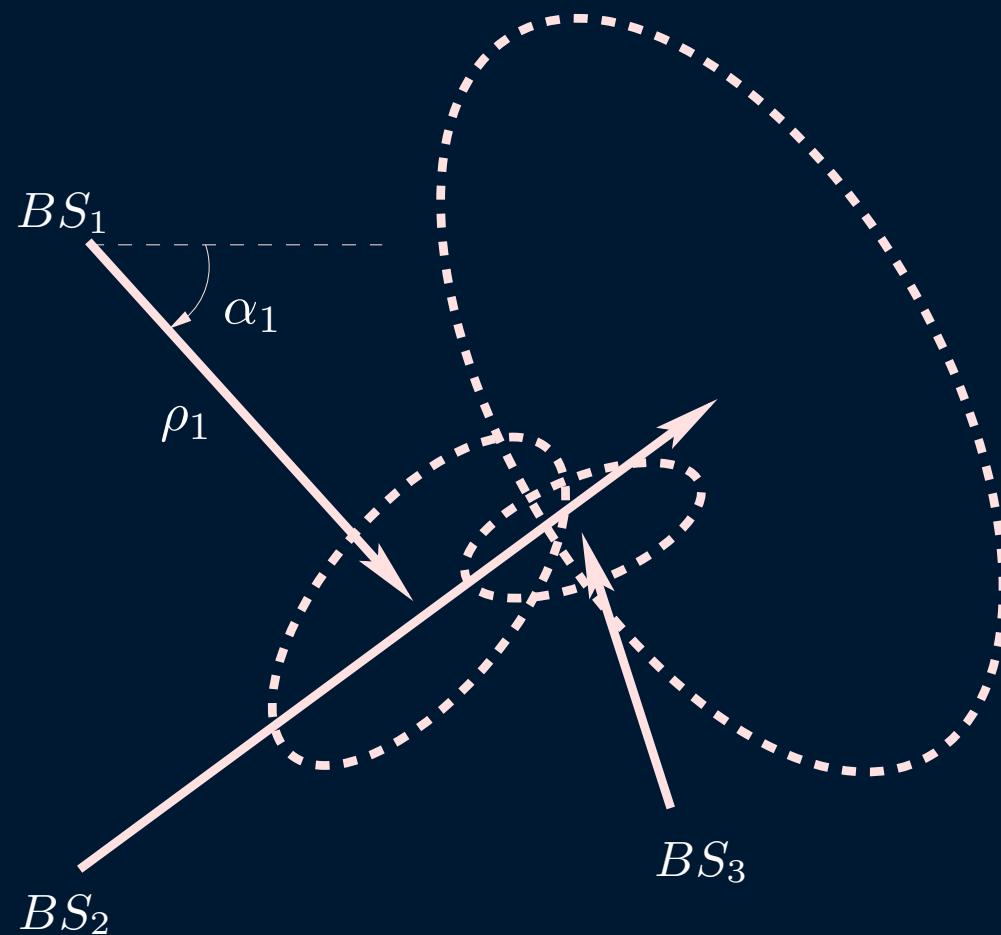
# position uncertainty



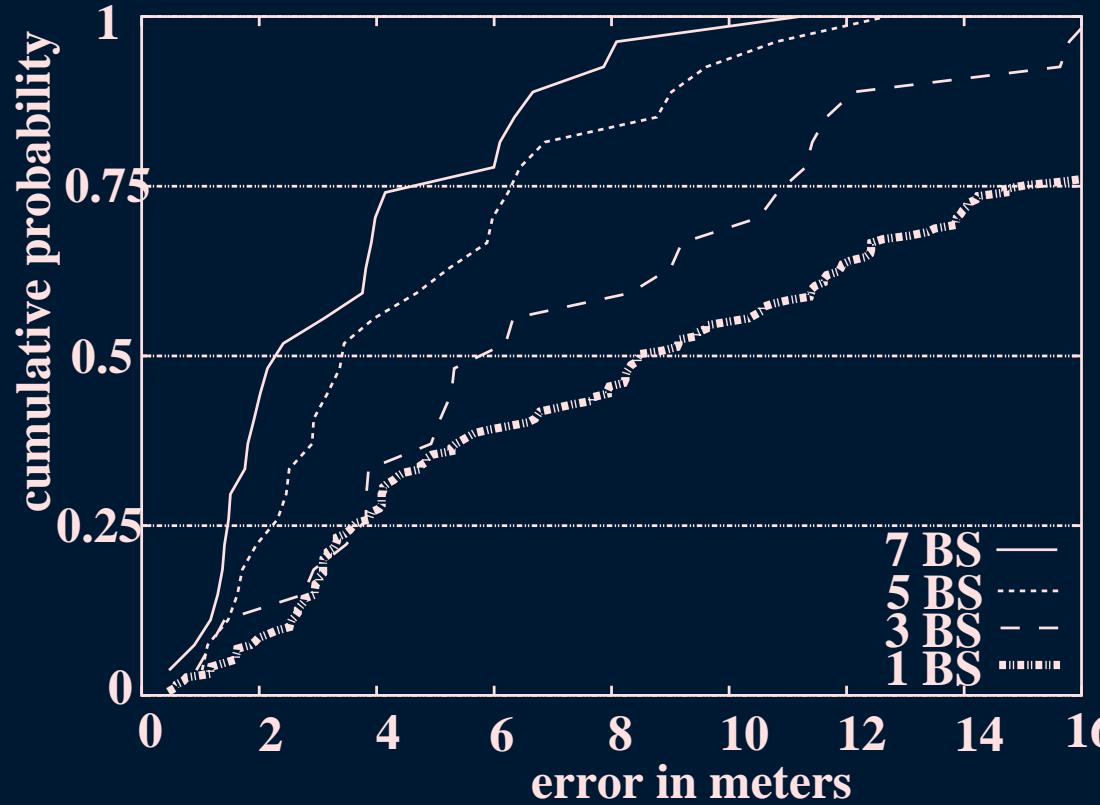
- approximate uncertainty as an ellipse
- error ellipse increases with distance
- $\sigma_a = 0.4$  radians  $\simeq 21^\circ$
- $\sigma_r = 0.2r$

# uncertainty w. ranges & angles

how to combine several readings? Kalman filter.



# positioning w. ranges & angles



- **more base stations  $\Rightarrow$  better positions**
- **2.1m median position error (all 7 BS)**

# discussion

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- triangulation with large outliers
- use more than two angles?
- no correlation between
  - angle error and distance
  - angle error and SS
- corridors ⇒ waveguides
- revolving signal at the mobile?
- data performance?

# summary

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- **VORBA = VOR base station**
- **complexity into the base station**
  - **less infrastructure**
  - **no SS map**
- **revolving basestation measures  $SS(\alpha)$  to derive**
  - **discrete angles**
  - **angle distributions**
  - **ranges**
- **works with quantized angles as well**
- **can achieve 2.1m - 4m median error**

# index

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- **indoor positioning**
- **trilateration**
  - Cricket
- **triangulation**
- **SS map**
  - RADAR
  - LANDMARC
- **VOR BAse station**
  - prototype
  - basic measurements
  - experiment setup
  - peak distribution
- **angle positioning**
  - discrete angles
  - quantized angles
  - angle distributions
- **range positioning**
- **range+angle pos.**
- **uncertainty**
- **performance**
- **discussion**
- **summary**