# **Personal Positioning Algorithms**



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# Personal positioning

for example, a mobile handset

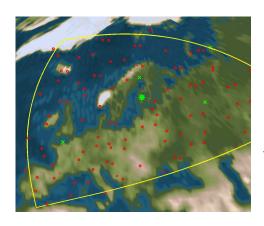
sources of positioning information:

- navigation equipment: GPS, IMU
- cellular network, WLAN, Bluetooth, . . .
- digital compass, step counter, barometer
- aiding data (altitude, cell sector, ...)
- digital maps
- etc.

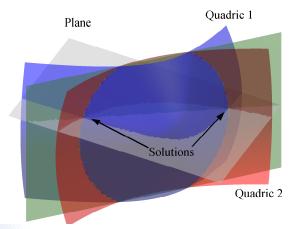
### Challenges

- large linearization errors
- scarce measurements underdetermined
- non-normal noise structure
- → make use of all available information
- → exploit the time dependency
- -- allow flexible measurement models

### Research highlights

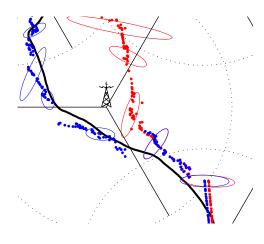


Solving position and time from GPS code phase measurements without the navigation data (2001)

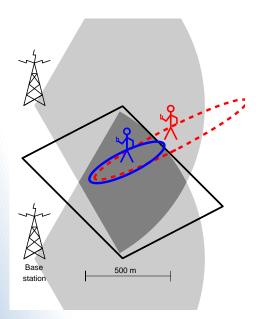


Versatile closed form solutions for hybrid positioning (2004)

### Research highlights



Inconsistency of EKF with nonlinear measurements (2005)

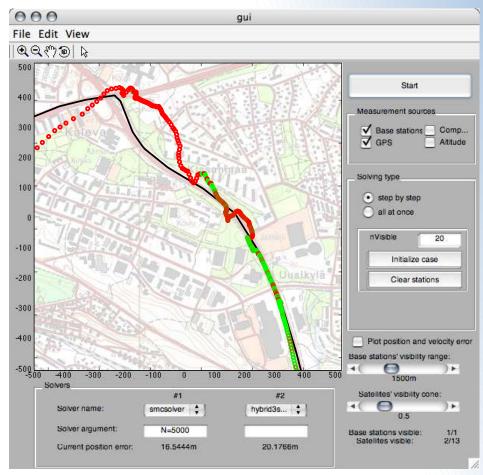


Modified EKF that uses restrictive information (2006)

### Research highlights

Simulation/real data test bench and visualization tools in Matlab

- EKF, 2nd order EKF, unscented KF
- Gaussian mixture
- particle filters
- point-mass & grid filters
- batch processing
- smoothing



# Discrete nonlinear filtering problem

Distribution of initial state  $x_0$  given.

Motion model:

$$x_{k+1} = f_k(x_k) + w_k$$

Measurement model:

$$y_k = h_k(x_k) + v_k$$

Optimal solution: recursive Bayesian filter

### Recursive Bayesian filter

### Prediction step:

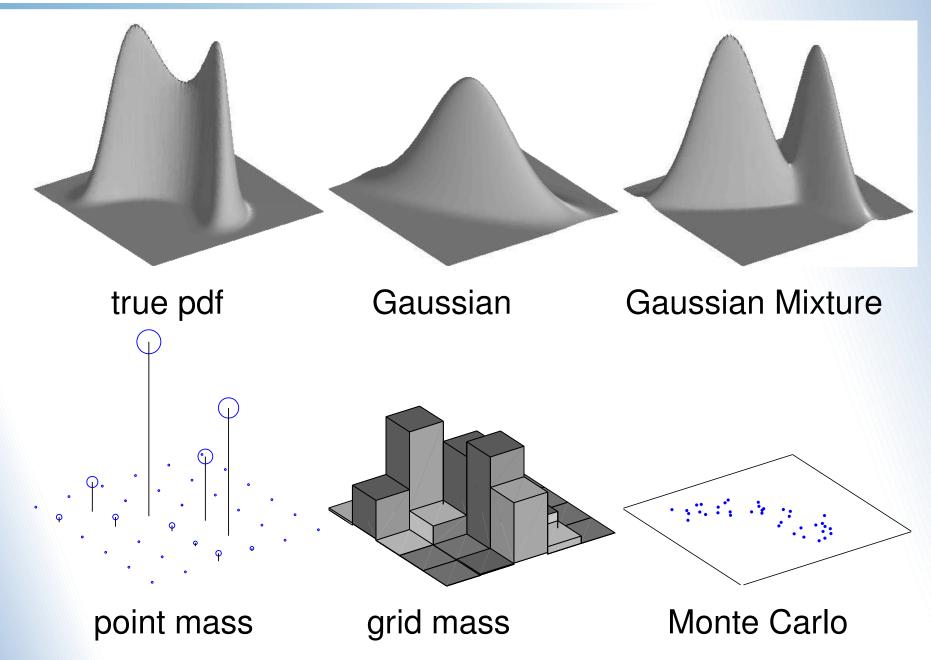
$$p(x_k \mid Y_{k-1}) = \int_{\mathbb{R}^d} \underbrace{p(x_k \mid x_{k-1})} p(x_{k-1} \mid Y_{k-1}) dx_{k-1}$$
 motion model previous

### Update step:

$$p(x_k \mid Y_k) \propto \underbrace{p(y_k \mid x_k)p(x_k \mid Y_{k-1})}_{\text{measurement}} \rightarrow \underbrace{\qquad \qquad }$$

In general, exact solution requires infinite time and memory!

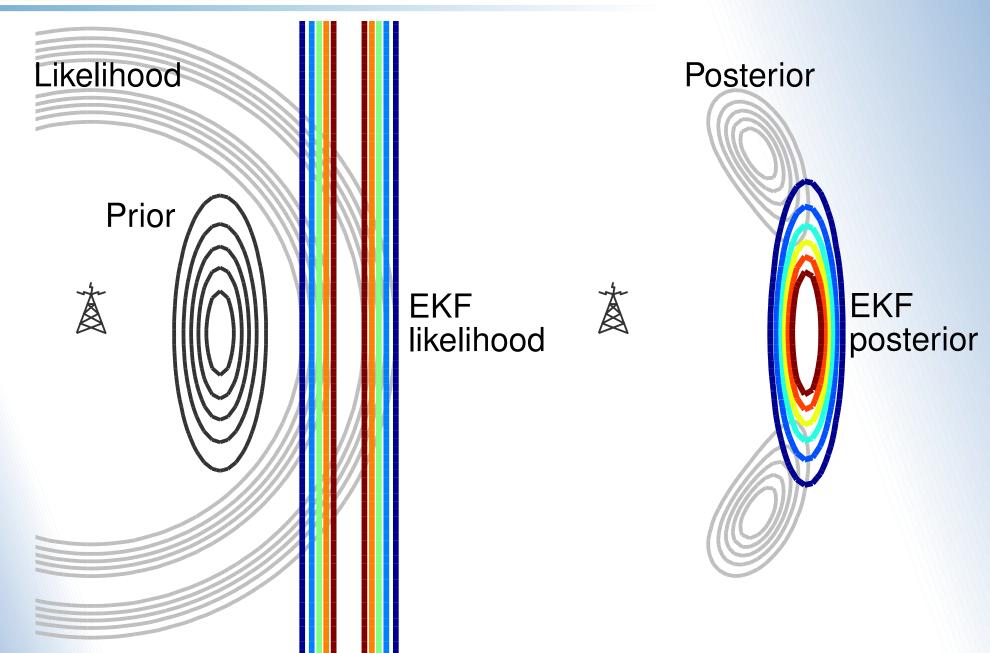
# Numerical pdf approximations



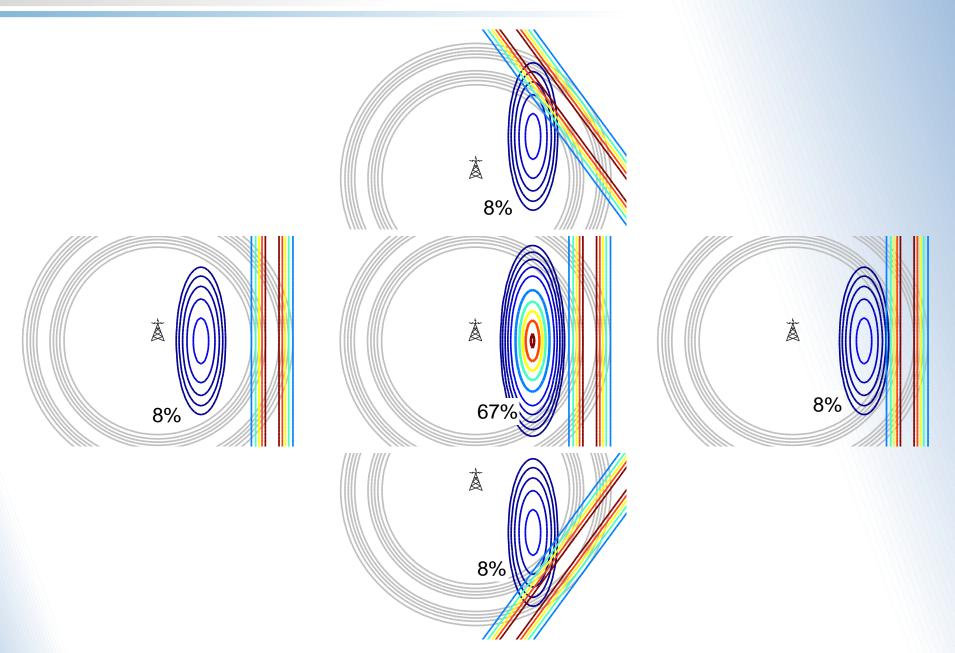


# **Examples**

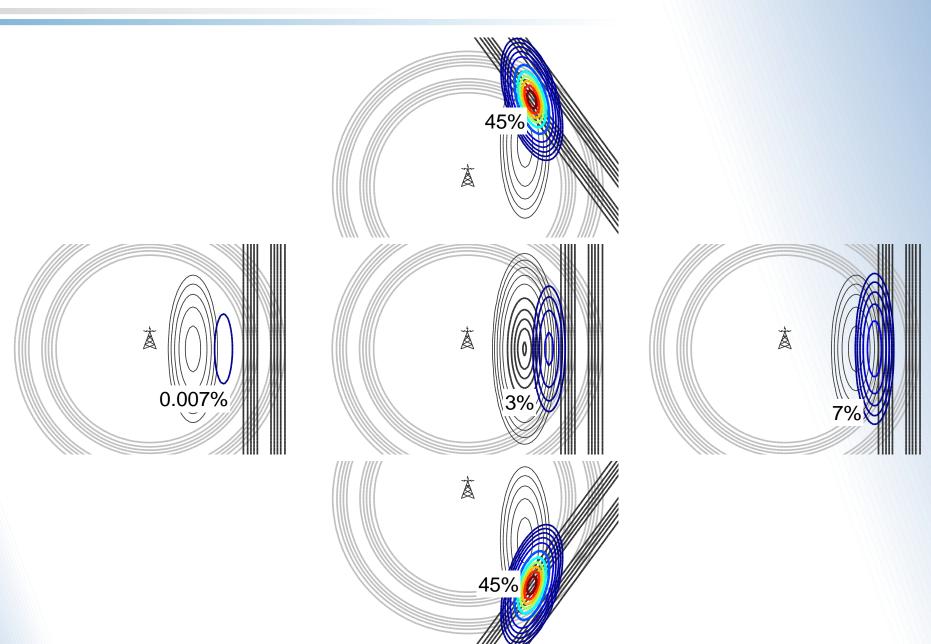
### Problem: linearization (EKF) does not work



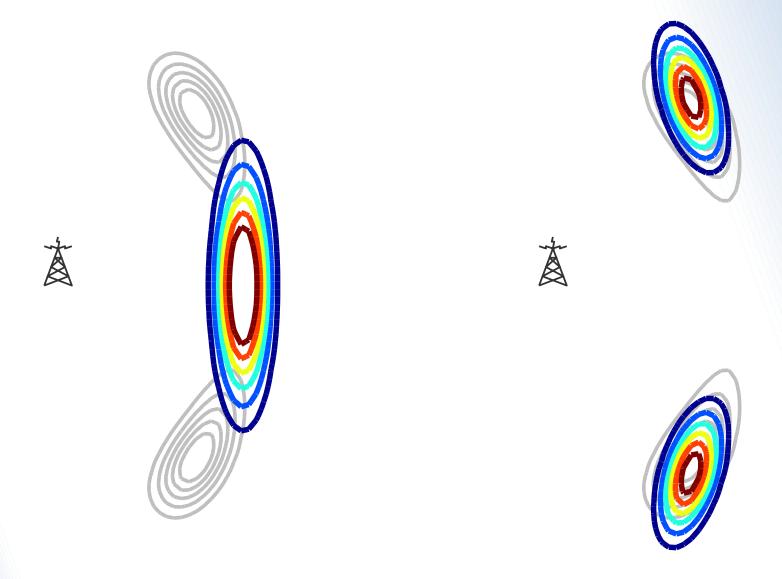
### Solution: Splitting prior into a Gaussian Mixture



### **Posterior is also Gaussian Mixture**



### EKF and GMF posteriors vs. correct posterior



# GPS + simulated BS range meas.

