

# EnTracked: Energy-Efficient Robust Position Tracking for Mobile Devices

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# AGENDA

- › Motivation
  - › Periodic tracking
  - › Dynamic tracking
- › EnTracked
- › Methods
- › Evaluation
- › Conclusions



# Motivation

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- › Mobile devices depend on battery power
- › Power consumption impacts application use

# MEASURING POWER CONSUMPTION

- > Profiling Power Consumption on N95 8GB
- > Nokia Energy Profiler Tool



Feature	Avg. Power [watt]
Idle	0.0621
Accelerometer	0.0503
GPS	0.324
UMTS Radio idle	0.466
UMTS Radio active	0.645

# POSITION TRACKING

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Position-Based  
Application

Tracking Server

Positioned  
Target

## > Tracking

- > For server to provide application with updates of the target position

# PERIODIC TRACKING

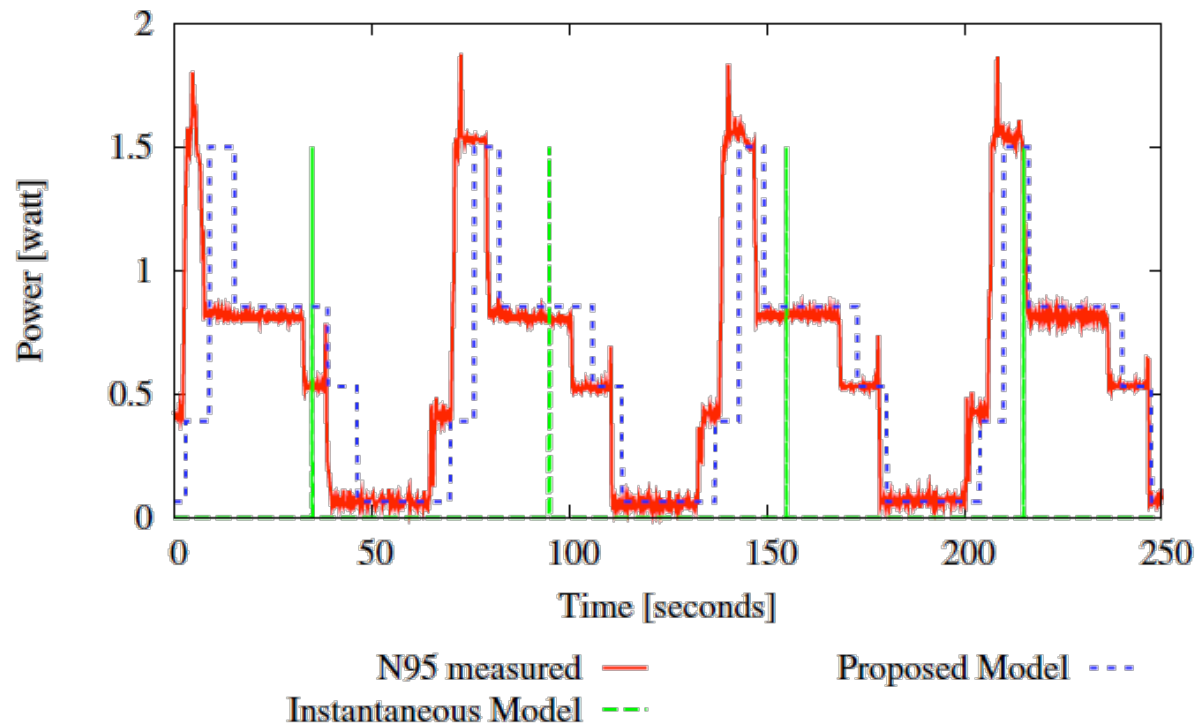
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- › Send position update every  $X$  seconds
- › Upper limit on latency of position updates
- › No guaranties for accuracy, walk 90 m or drive 1 km
- › Simple to implement

A. Leonhardi and K. Rothermel. A comparison of protocols for updating location information. Cluster Computing, 4(4):355–367, 2001.

# PERIODIC TRACKING

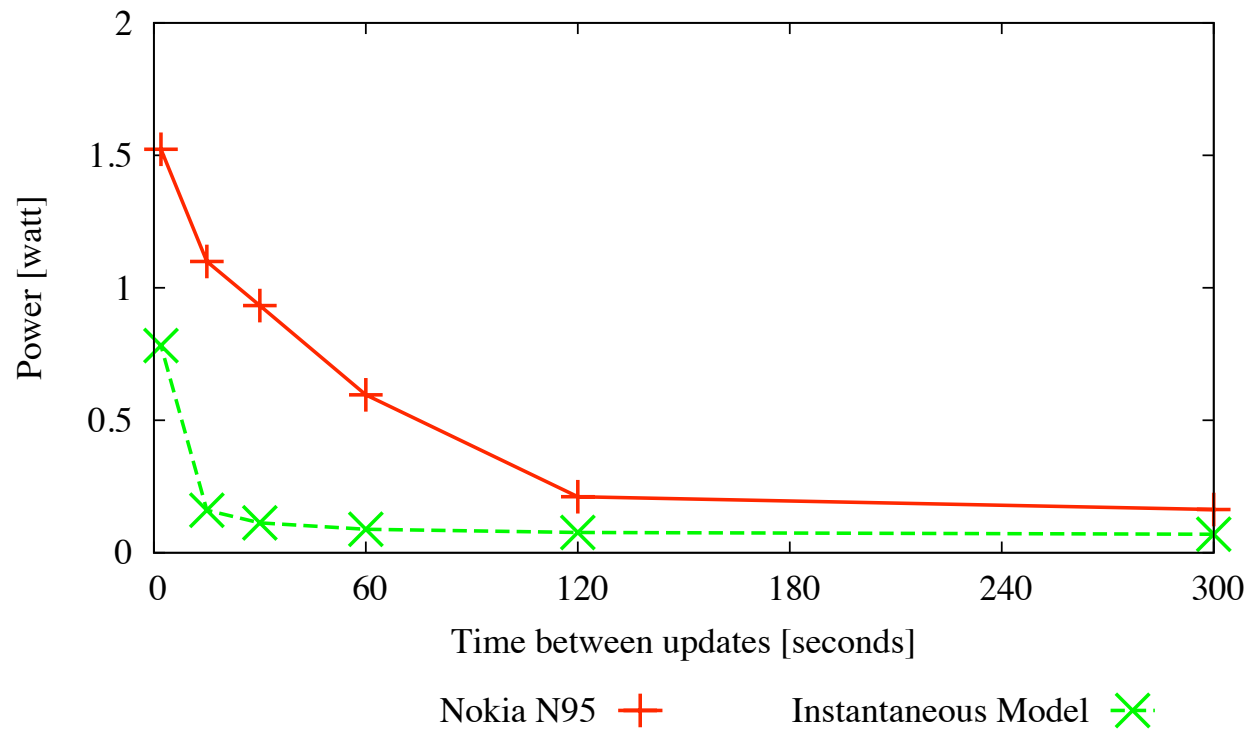
> X=60 seconds



T. Farrell, R. Lange, and K. Rothermel. Energy-efficient tracking of mobile objects with early distance-based reporting. In Proceedings of 4th Int. Conference on Mobile and Ubiquitous Systems (Mobiquitous 2007).

# PERIODIC UPDATING

> Averages for 1-300 seconds





# DYNAMIC TRACKING

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› Adapt position updates to satisfy error threshold

› Sources of thresholds

› Map zoom level (50-500 m)

› Proximity detection algorithms (1-10000 m)

A. Küpper and G. Treu. Efficient proximity and separation detection among mobile targets for supporting location-based community services. *Mobile Computing and Communications Review*, 10(3):1-12, 2006.

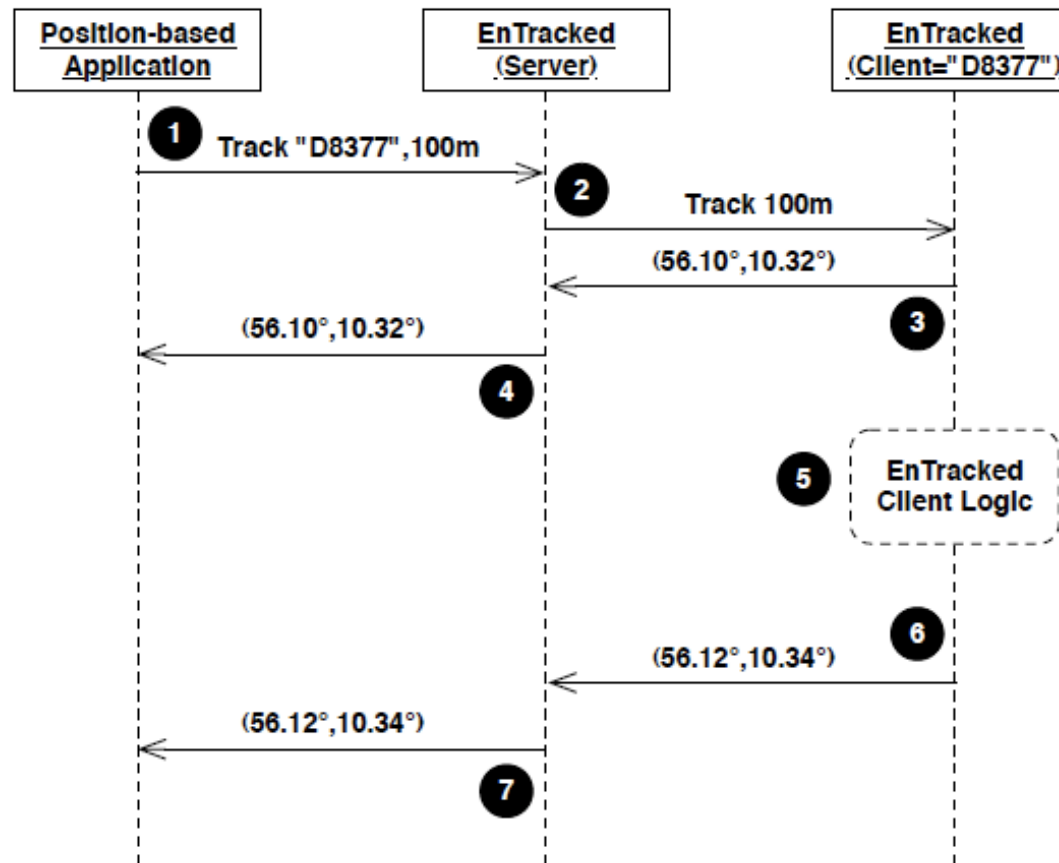
› Complex implementation

# EnTracked

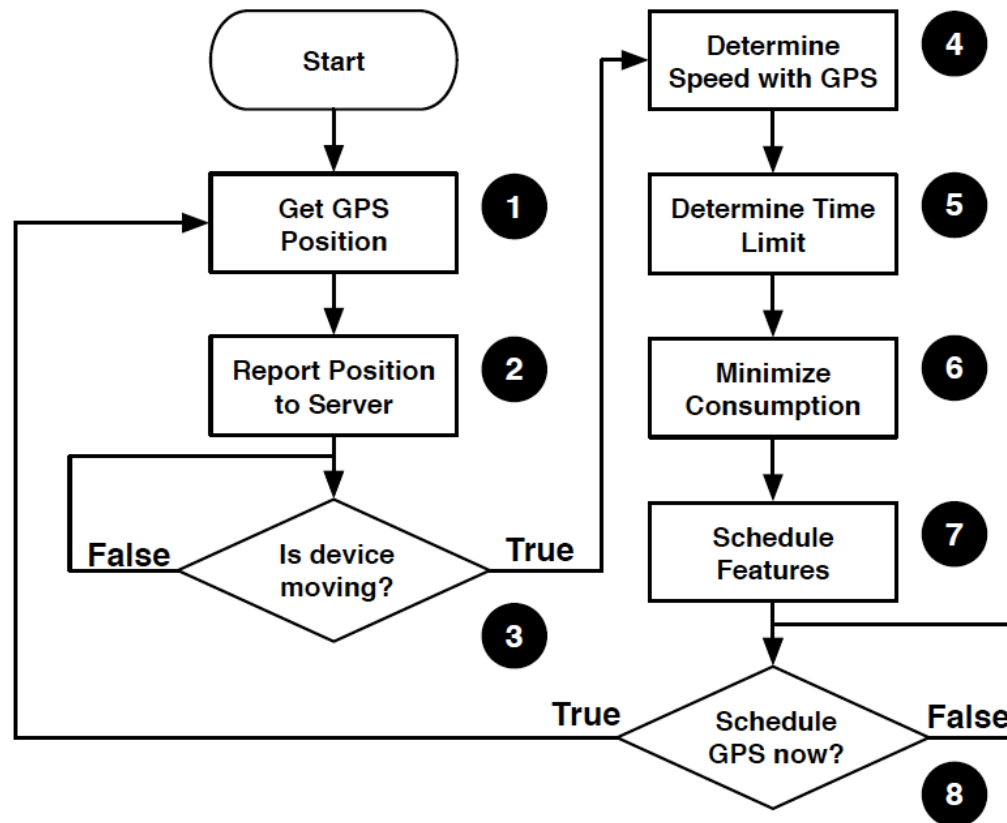
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- › EnTracked – a dynamic tracking system
- › Goals
  - › Minimize energy consumption (turning features off)
  - › Optimize robustness (position within error thresholds)
- › Adapt based on estimating and predicting system conditions and mobility

# ARCHITECTURE



# EnTracked – CLIENT SIDE LOGIC



# DERTEMINE TIME LIMIT

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> Time limit for delivering a new fix to server

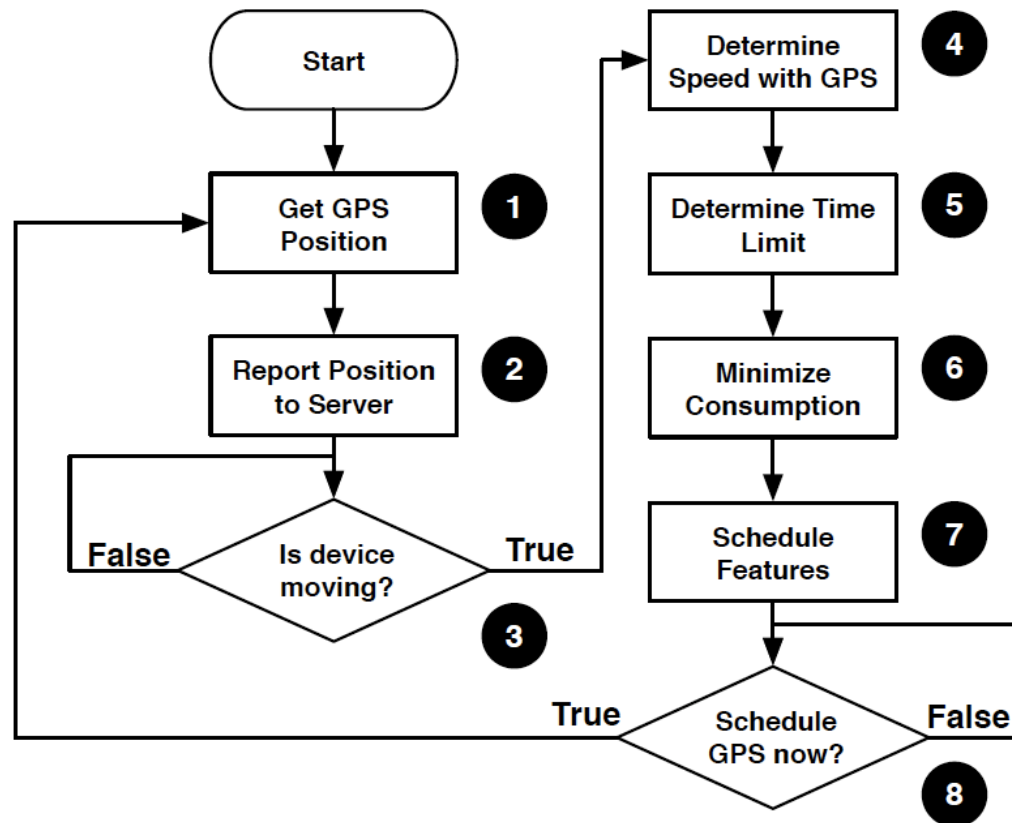
$$t_{limit} = \frac{d_{limit} - e_{model}}{V_{est}}$$

$d_{limit}$ : user error limit

$e_{model}$ : estimated error of server-known position

$V_{est}$ : GPS speed estimate + speed estimate accuracy

# EnTracked – CLIENT SIDE LOGIC



# MINIMIZE CONSUMPTION

$$req_g(x) = \begin{cases} 1 & \text{if } x \leq 30 \\ 6 & \text{if } x > 30 \end{cases} \quad \text{Delay functions}$$

$$req_s(x) = 1$$

Recursive Power Function

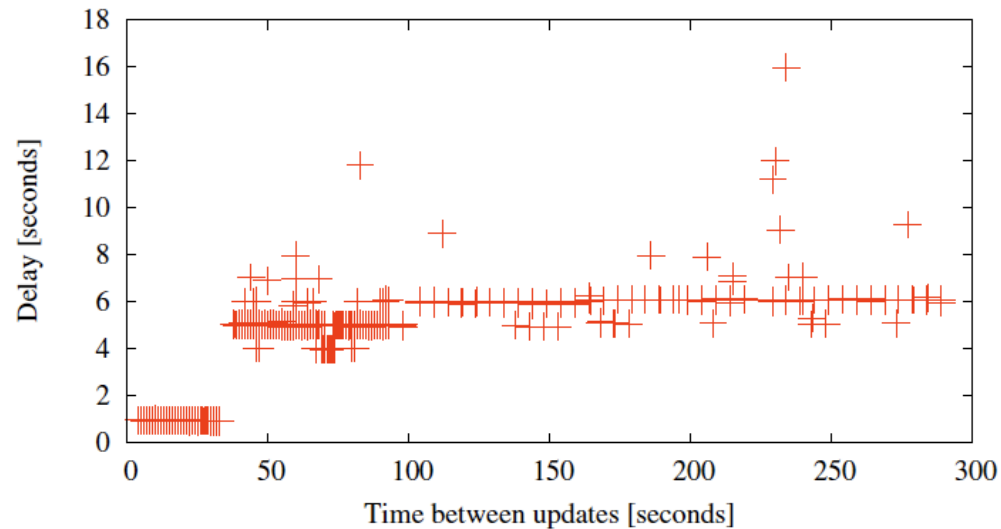
$$C_{u,p}(t, x, x_0) = \begin{cases} 0 & \text{if } t = 0, x = x_0 \\ p + C_{u,p}(t - 1, x) & \text{if } t > 0, x = 0 \\ C_{u,p}(t - 1, x - 1) & \text{if } t > 0, x > u \\ p + C_{u,p}(t - 1, x - 1) & \text{if } t > 0, 0 < x \leq u \\ \text{Undefined} & \text{else} \end{cases}$$

$$(g'', r'', s'') = \arg \min_{g,r,s} \{ C_{30,0.324}(t - req_g(g), g, g_0) + C_{31,0.466}(t, r, r_0) + C_{6,0.645}(t, s, s_0) | t = t_{limit} - req_s(s) \}$$

Minimization function

# DELAY MODEL FOR GPS

## > Time To First Fix for Assisted-GPS with Nokia N95 8GB



$$req_g(x) = \begin{cases} 1 & \text{if } x \leq 30 \\ 6 & \text{if } x > 30 \end{cases}$$



# MINIMIZE CONSUMPTION

$$req_g(x) = \begin{cases} 1 & \text{if } x \leq 30 \\ 6 & \text{if } x > 30 \end{cases}$$

Delay functions

$$req_s(x) = 1$$

Recursive Power Function

$$C_{u,p}(t, x, x_0) = \begin{cases} 0 & \text{if } t = 0, x = x_0 \\ p + C_{u,p}(t - 1, x) & \text{if } t > 0, x = 0 \\ C_{u,p}(t - 1, x - 1) & \text{if } t > 0, x > u \\ p + C_{u,p}(t - 1, x - 1) & \text{if } t > 0, 0 < x \leq u \\ \text{Undefined} & \text{else} \end{cases}$$

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Minimization function

# RECURSIVE POWER FUNCTION

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- >  $r_0$ : seconds since an active radio was asked to power off
- >  $t_{\text{limit}}$ : the limit for getting a new fix
- >  $r''$ : when to turn the radio on

# RECURSIVE POWER FUNCTION

$$C_{6,0.645}(t_{\text{limit}} - \text{req}_s(r), r, r_0), t_{\text{limit}} = 10, r_0 = 0$$

	0	1	2	3	4	5	6	7	8	9
0	0	0,645	1,29	1,935	2,58	3,225	3,87	4,515	4,515	4,515
1	-	0,645	1,29	1,935	2,58	3,225	3,87	4,515	5,16	5,16
2	-	-	1,29	1,935	2,58	3,225	3,87	4,515	5,16	5,805
3	-	-	-	1,935	2,58	3,225	3,87	4,515	5,16	5,805
4	-	-	-	-	2,58	3,225	3,87	4,515	5,16	5,805
5	-	-	-	-	-	3,225	3,87	4,515	5,16	5,805
6	-	-	-	-	-	-	3,87	4,515	5,16	5,805
7	-	-	-	-	-	-	-	3,87	5,16	5,805
8	-	-	-	-	-	-	-	-	3,87	5,805
9	-	-	-	-	-	-	-	-	-	3,87

$$r'' = 9$$

# MINIMIZE CONSUMPTION

$$req_g(x) = \begin{cases} 1 & \text{if } x \leq 30 \\ 6 & \text{if } x > 30 \end{cases} \quad \text{Delay functions}$$

$$req_s(x) = 1$$

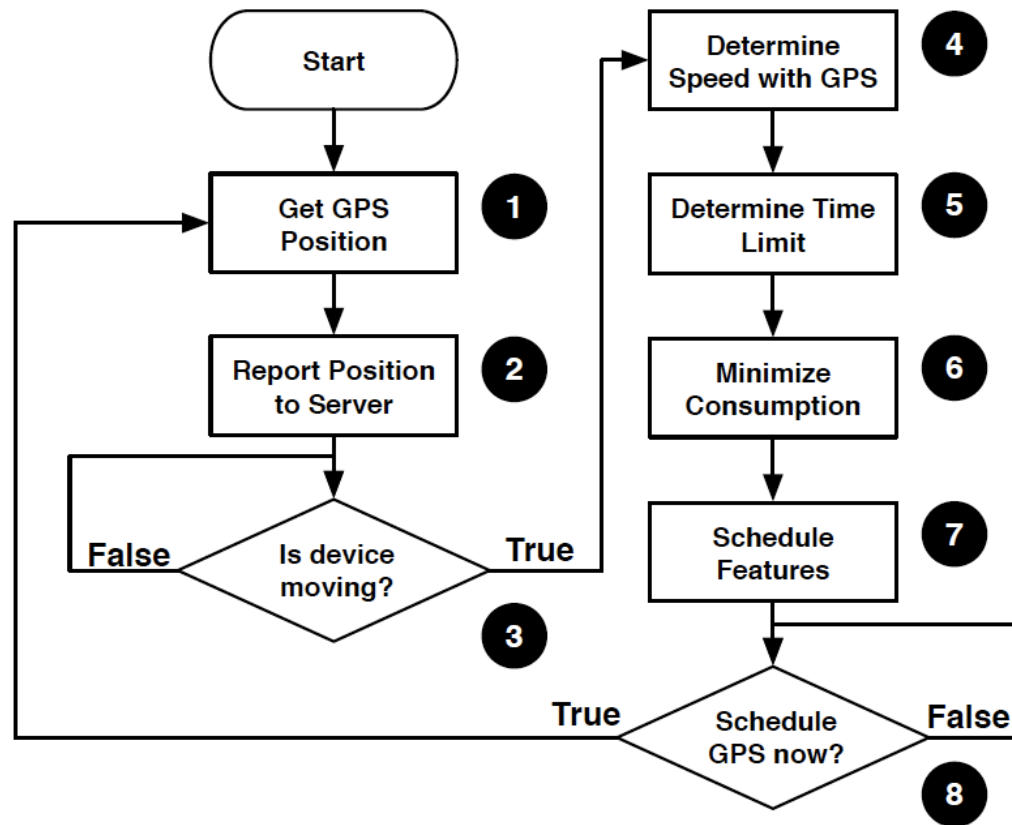
Recursive Power Function

$$C_{u,p}(t, x, x_0) = \begin{cases} 0 & \text{if } t = 0, x = x_0 \\ p + C_{u,p}(t - 1, x) & \text{if } t > 0, x = 0 \\ C_{u,p}(t - 1, x - 1) & \text{if } t > 0, x > u \\ p + C_{u,p}(t - 1, x - 1) & \text{if } t > 0, 0 < x \leq u \\ \text{Undefined} & \text{else} \end{cases}$$

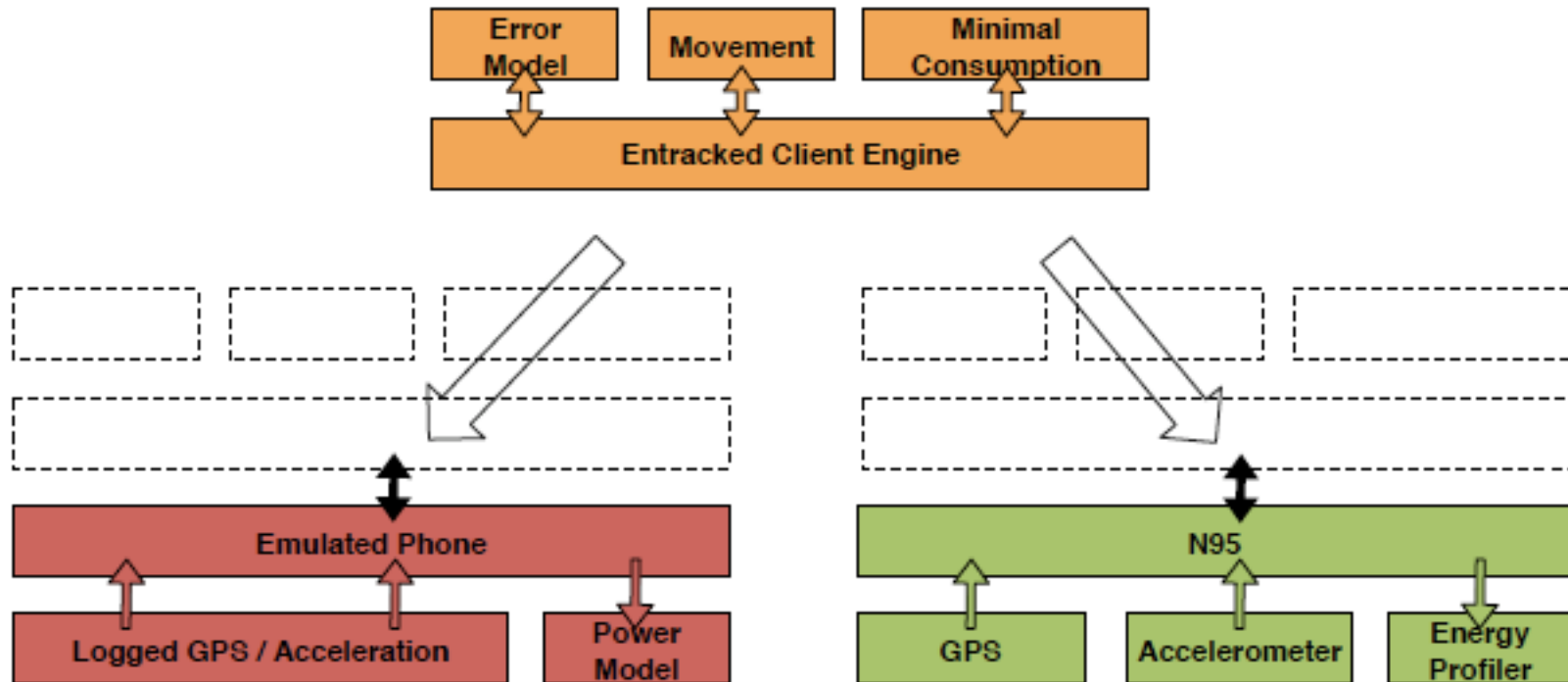
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Minimization function

# EnTracked – CLIENT SIDE LOGIC



# IMPLEMENTATION



# DEPLOYMENT

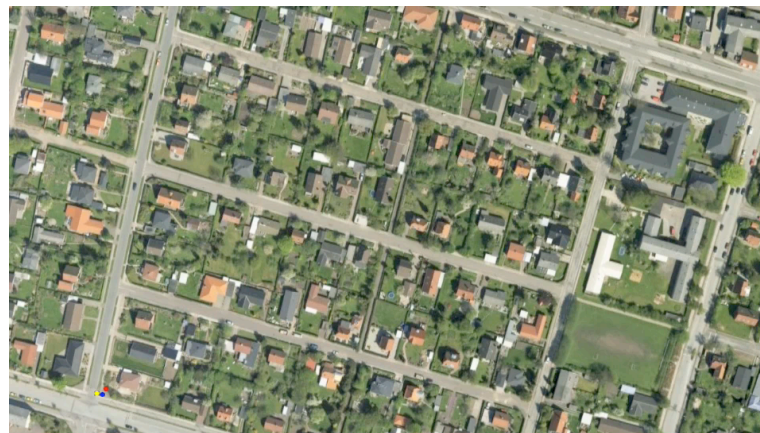
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- › EnTracked Server
  - › Implemented in Java
  - › Running on a public IP adresse
- › EnTracked Client
  - › N95 8GB
  - › Implemented in Python for S60
- › Connection between client and server over UMTS using TCP.
- › Nokia Energy Profiler
- › Position error using manual-entered ground truth

# EnTracked - Video

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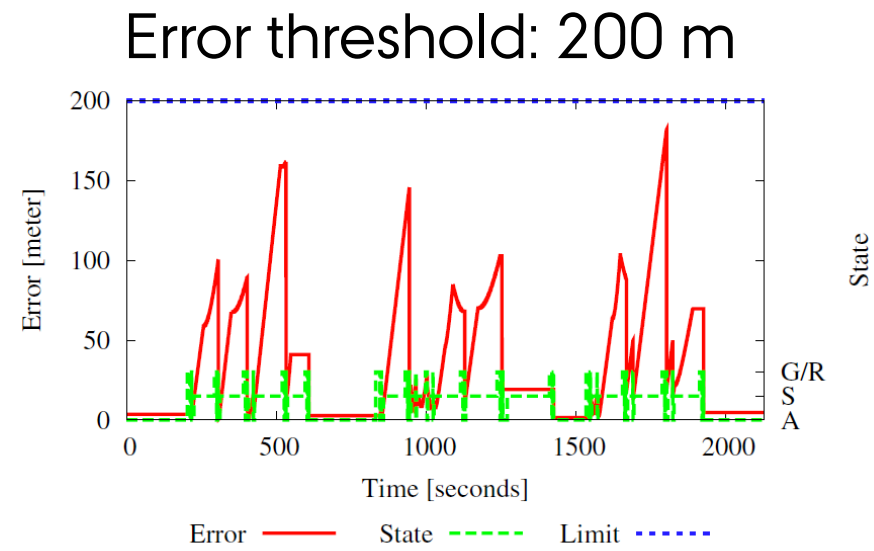
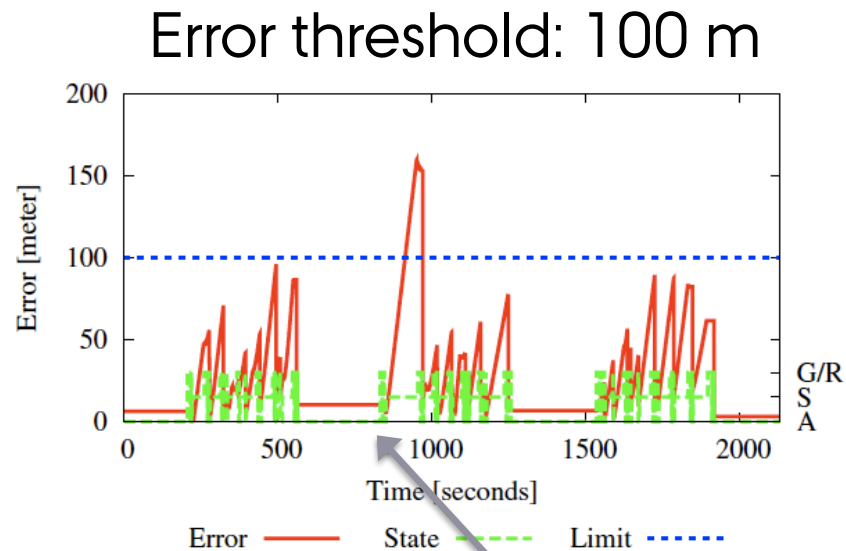
- › Yellow (worm) – Ground Truth
- › Red - EnTracked with user error threshold 100 meter
- › Blue - EnTracked with user error threshold 200 meter





# ROBUSTNESS

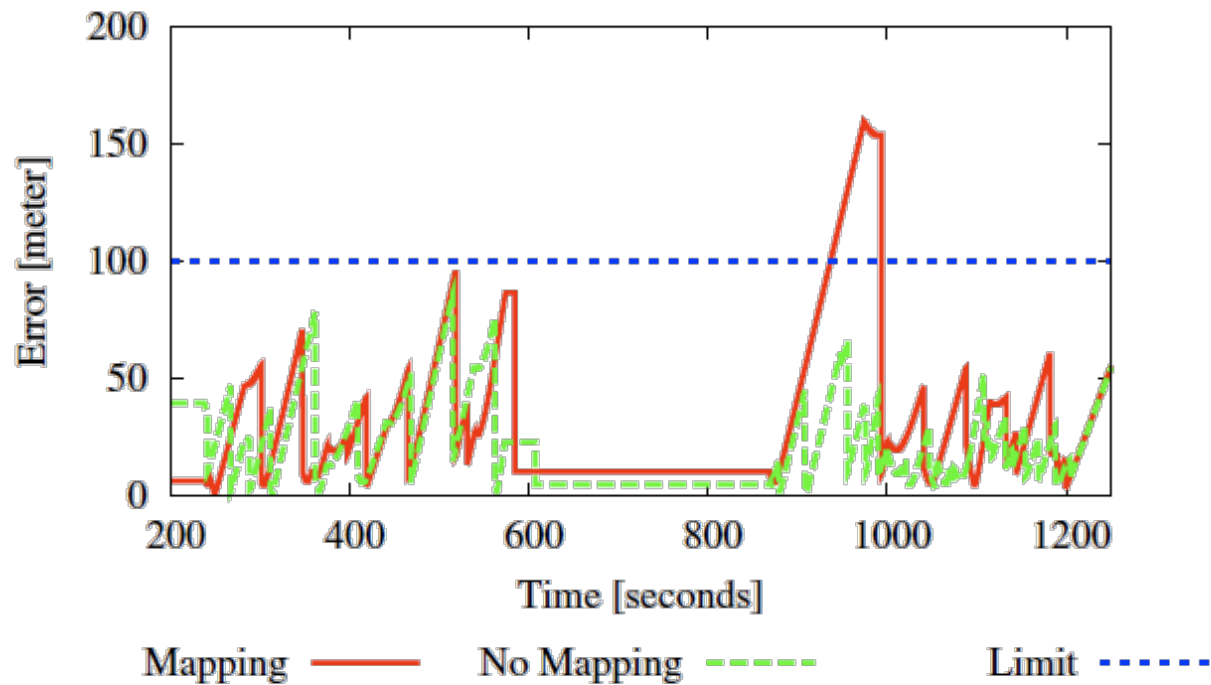
## > Error of server-known position



Speed estimated to low

# ROBUSTNESS

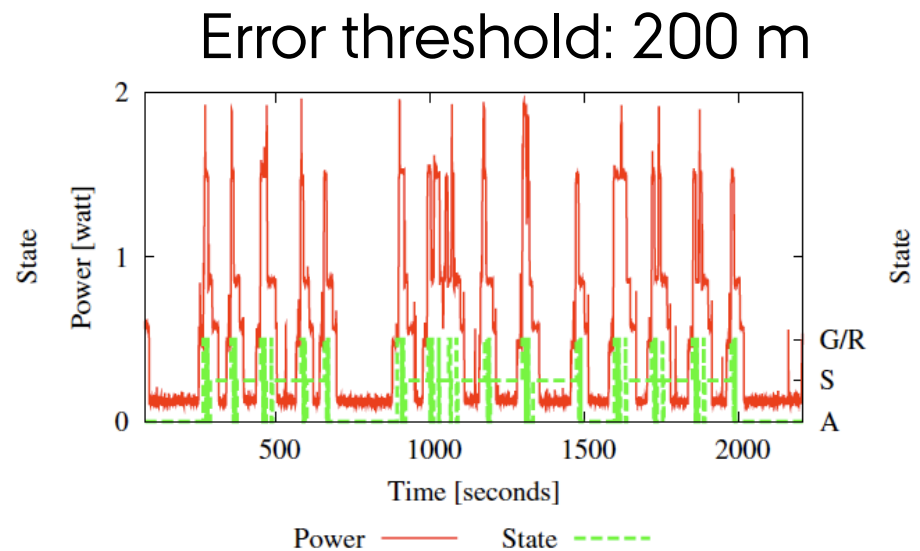
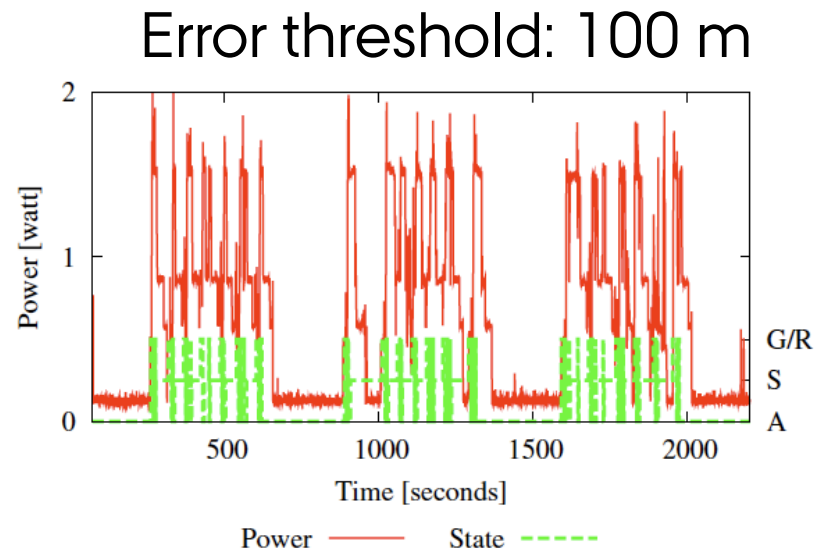
› Trust position estimates less



› Other option would be to trust speed less

# ENERGY EFFICIENCY

> Measured with Nokia Energy Profiler



# DISCUSSION

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- › Depend on request patterns
  - › Need position twice a day (Use a request protocol)
  - › Anytime within limit (Use EnTracked)
- › Depend on movement patterns
  - › Moving fast all the time (Small savings)
  - › Moving fast only a few times a day (Large savings)

# Conclusions

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- › EnTracked – a dynamic tracking system
- › Methods for changing system conditions
  - › Speed and speed accuracy
  - › Position accuracy
  - › Mobility
- › Minimization algorithm to select optimal plan
- › Evaluation in terms of both emulation and deployment for energy-efficiency and robustness