

Efficient Smartphone Position Detection Using Neural Networks

Mobile Sensing Systems Lab

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SS15



Introduction

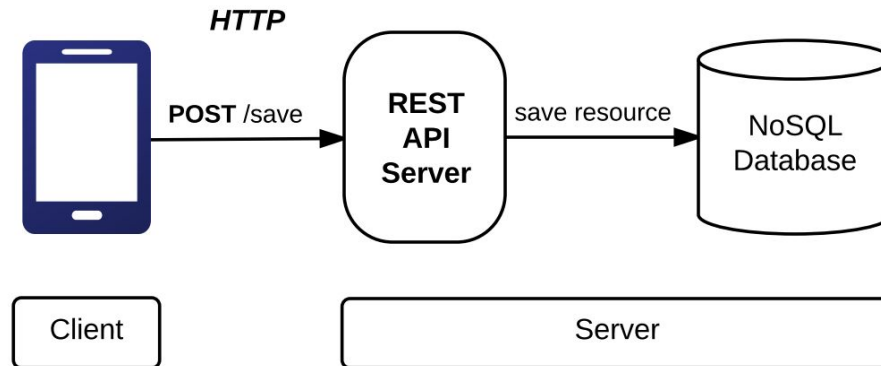
- Context Awareness
- Challenges
 - ◆ Difficulties in Training
 - ◆ Variety of User Behaviors
 - ◆ Multiple Devices

Implementation

- Sample Collection
- Training
- Prediction

Sample Collection

- NoSQL Database on AWS EC2
- RESTful Server in Node.js



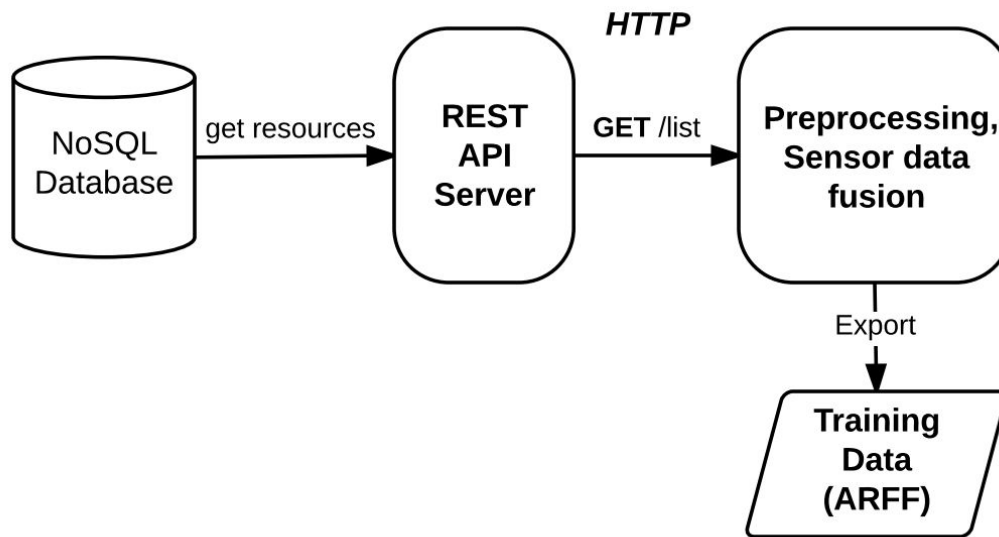
Sample Collection

- Sampling Rate of 500ms.
- Position Labels: “InHand”, “SidePocket”, “Idle”, “Handbag”.
- Experimental Noise

```
{"t":1440867810092,"v0":1013.56,"n":"pressure","p":"InHand","e":0},  
{"t":1440867810113,"v0":-0.17266846,"v1":-0.0725708,"v2":9.80484  
,"n":"gravity","p":"InHand","e":0},  
{"t":1440867810114,"v0":0.064941406,"v1":0.09411621,"v2":-0.1418457,"n"  
:"linacc","p":"InHand","e":0},  
...
```

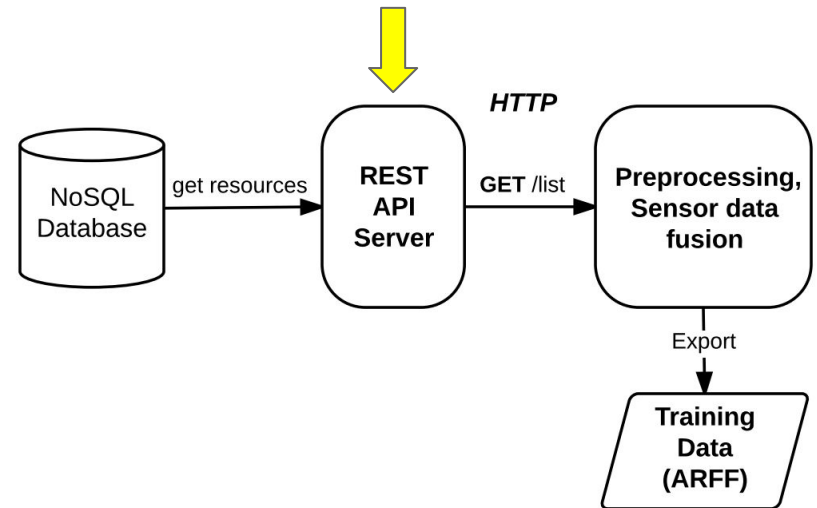
Training

- Query
- Sensor Fusion
- Exporting
- Training Model



Training: Query

- RESTful API
- Query on Specific Timeframe
- JSON Format



Training: Sensor Fusion

Raw sample data (revisited):

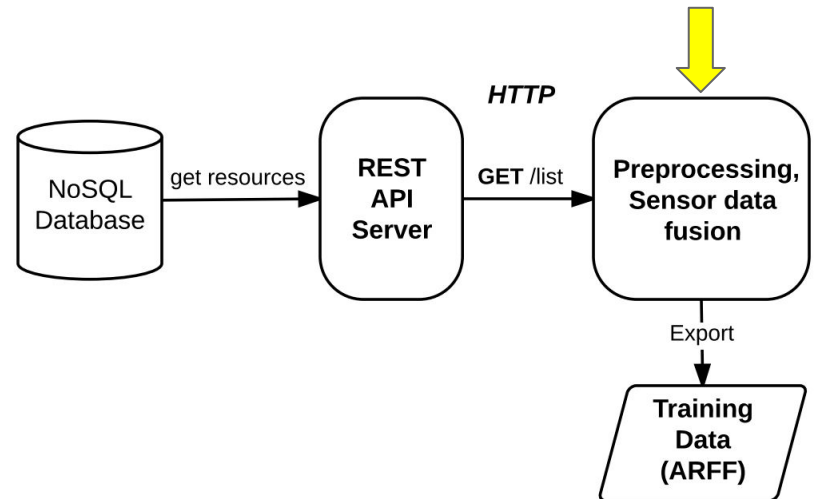
```
{
  "t":1440867810092,
  "v0":1013.56,
  "n":"pressure",
  "p":"InHand",
  "e":0},
{
  "t":1440867810113,
  "v0":-0.17266846,
  "v1":-0.0725708,
  "v2":9.80484,
  "n":"gravity",
  "p":"InHand",
  "e":0},
{
  "t":1440867810114,
  "v0":0.064941406,
  "v1":0.09411621,
  "v2":-0.1418457,
  "n":"linacc",
  "p":"InHand",
  "e":0},
{
  "t":1440796909166,
  "v0":-0.11802673,
  "v1":0.48486328,
  "v2":-0.20988464,
  "n":"rotation",
  "p":"SidePocket",
  "e":0},
{
  "t":1440796909202,
  "v0":19,
  "n":"light",
  "p":"SidePocket",
  "e":0},
...
```

- Remove experimental noise
- Fuse sensor data
- Add mathematical features

Sample Pool:

496654 raw sensor readings

29464 training instances



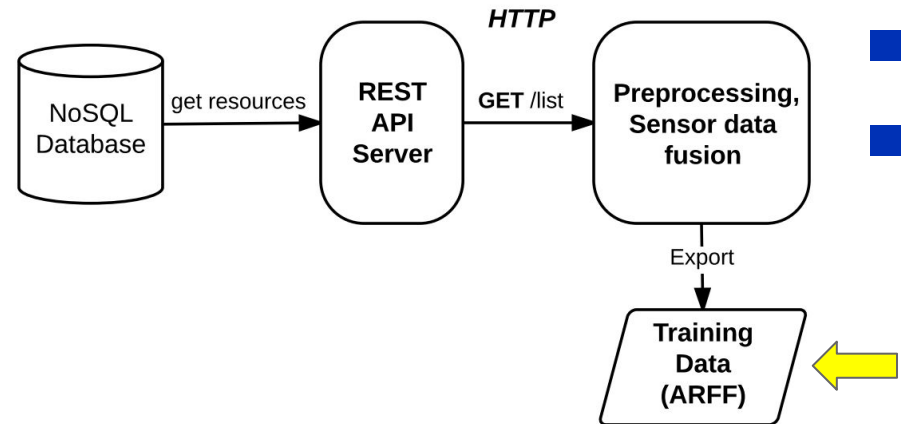
Training: Conversion and Exporting

```
@relation 1441901290_complex_features
```

```
@attribute linaccX numeric
@attribute linaccY numeric
@attribute linaccZ numeric
@attribute linaccMag numeric
@attribute rotationX numeric
@attribute rotationY numeric
@attribute rotationZ numeric
@attribute pressure numeric
@attribute light numeric
@attribute proximity numeric
@attribute gravityX numeric
@attribute gravityY numeric
@attribute gravityZ numeric
@attribute position {SidePocket,Idle,InHand,Handbag}
```

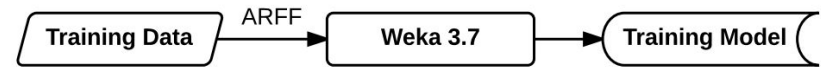
```
@data
```

```
0.0261 0.0170 0.0154 0.0294 0.4287 0.8387 -0.1052 1010.6511 11.6 0 -4.1589 -0.1735 -8.8652 SidePocket
0.0228 0.0761 0.0212 0.1441 0.4263 0.8775 -0.1043 1010.6517 11.6 0 -4.1935 -0.1815 -8.8630 SidePocket
...
```



*** For the sake of this presentation, all values are truncated to four floating digits**

Training: Model



Multilayer Perceptron

Nodes: 13 - 8 - 8 - 4

29464 instances

SidePocket: 5350

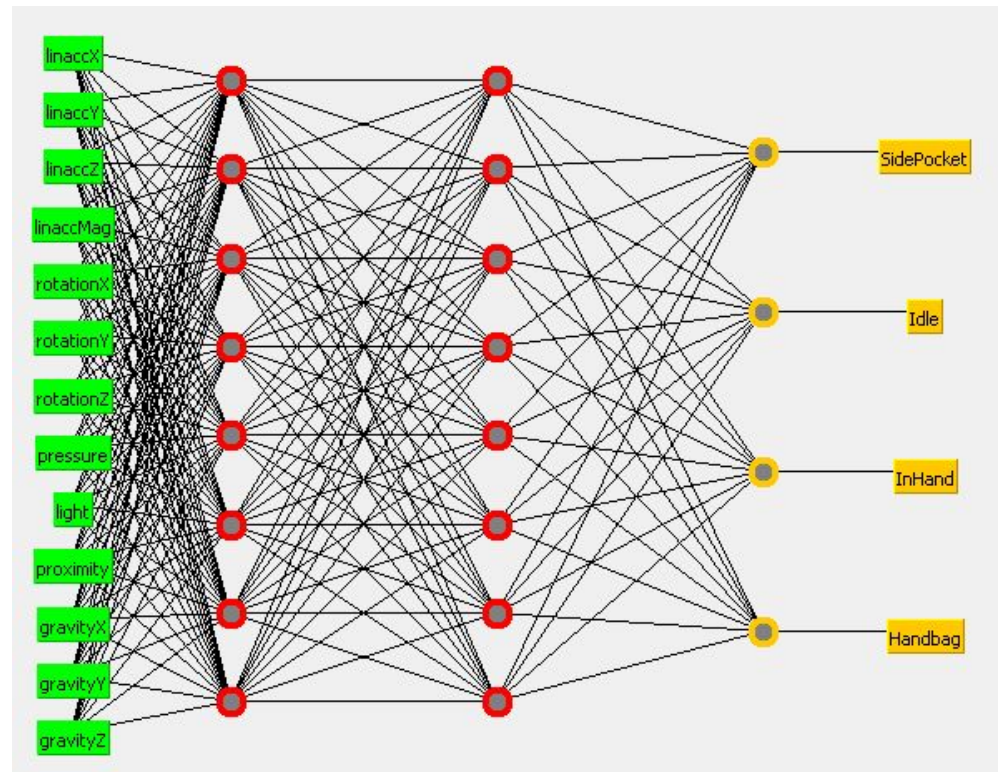
Idle: 11348

InHand: 7270

Handbag: 5496

Learning rate: 0.3

Iterations: 500



Training: Model

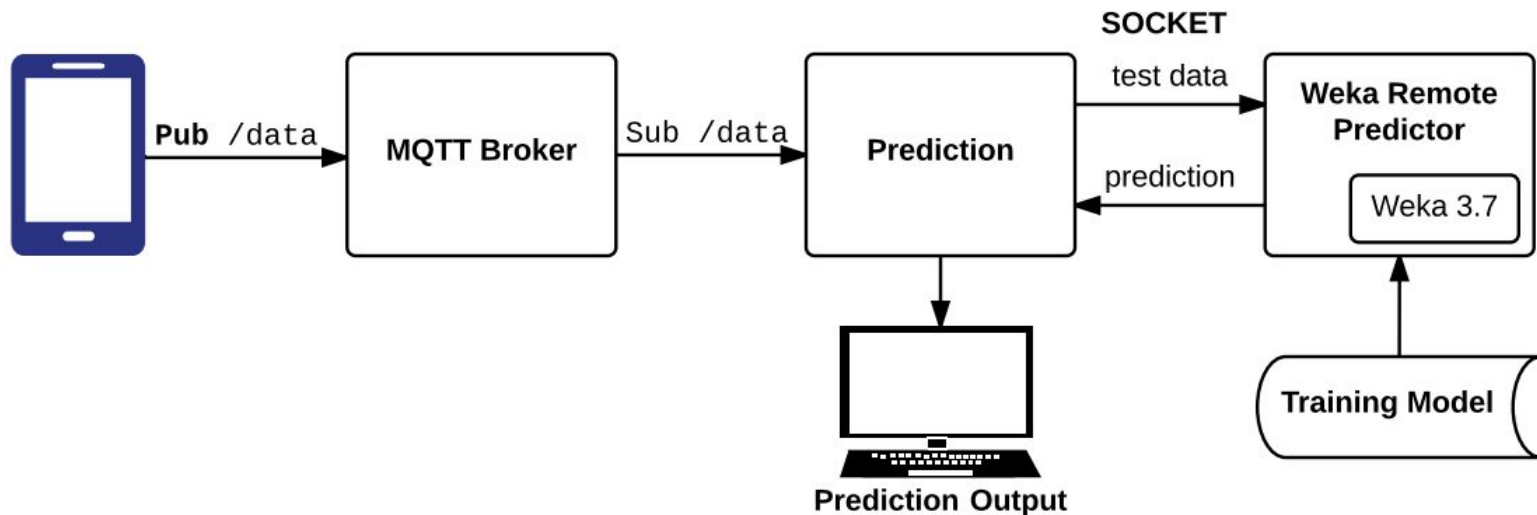
10-folds cross validation

99.8% accuracy over training data

	SidePocket	Idle	InHand	Handbag
SidePocket	5326	0	2	22
Idle	1	11347	0	0
InHand	0	0	7270	0
Handbag	13	0	0	5483

Prediction

- Real-time sensor data transmission
- Pre-processing
 - ◆ Sensor data fusion
 - ◆ Mathematical features
- Classification



Evaluation

24774 raw sensor readings

1266 training instances

	SidePocket	Idle	InHand	Handbag
SidePocket	267	1	0	38
Idle	0	288	0	0
InHand	1	21	238	2
Handbag	10	53	0	347

	SidePocket	Idle	InHand	Handbag
Precision	96%	79%	100%	90%
Recall	87%	100%	91%	85%
Accuracy	86%	79%	92%	80%

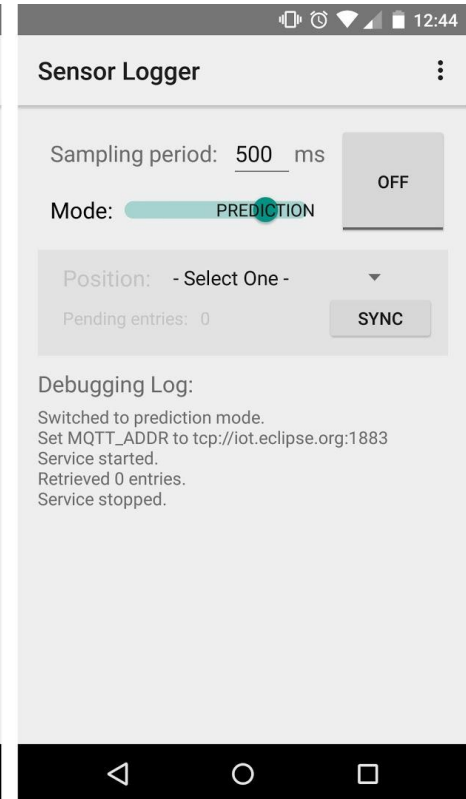
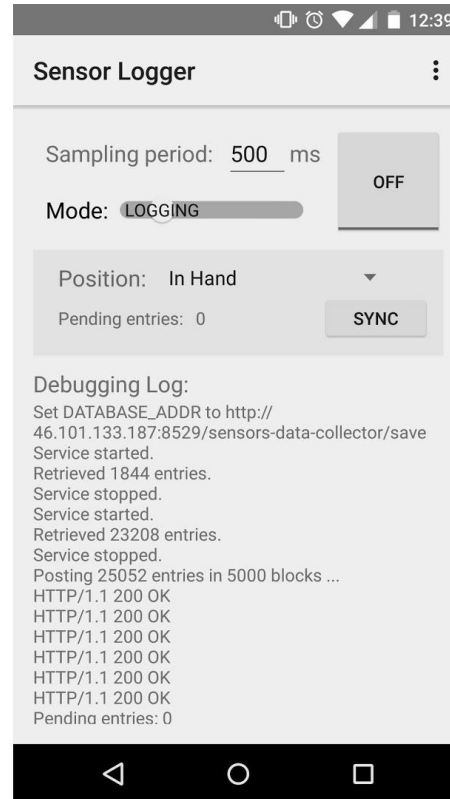
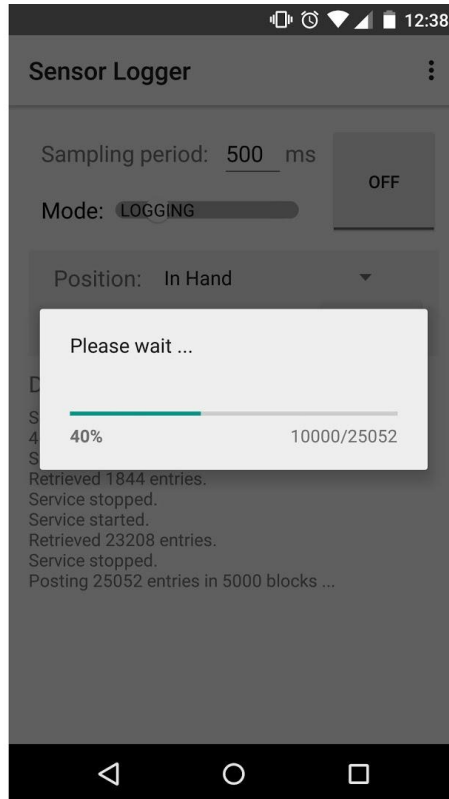
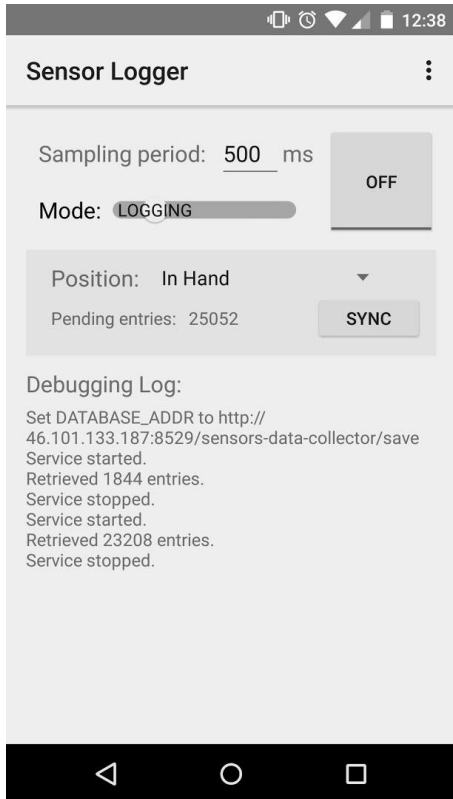
Average

91% precision

91% recall

84% accuracy

Demo



Q & A

