



# Network Driven Behaviour Modelling for Designing User Centred IoT Services

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Internet of Things Research

@raswak

**Bell Labs**  
Alcatel-Lucent 





**Everything is Connected**





**2 Questions**





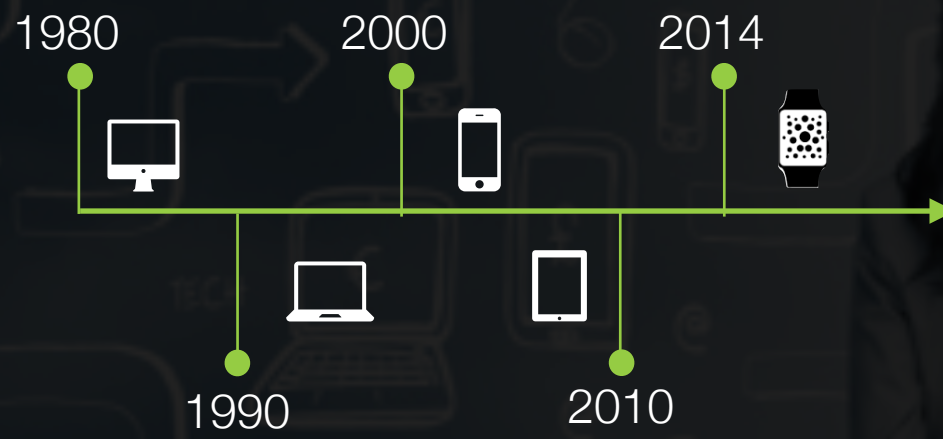
**Internet is all about Human Experience not Bits and Bytes!**





**What Human Experience will be defined by an IoT enabled World?**



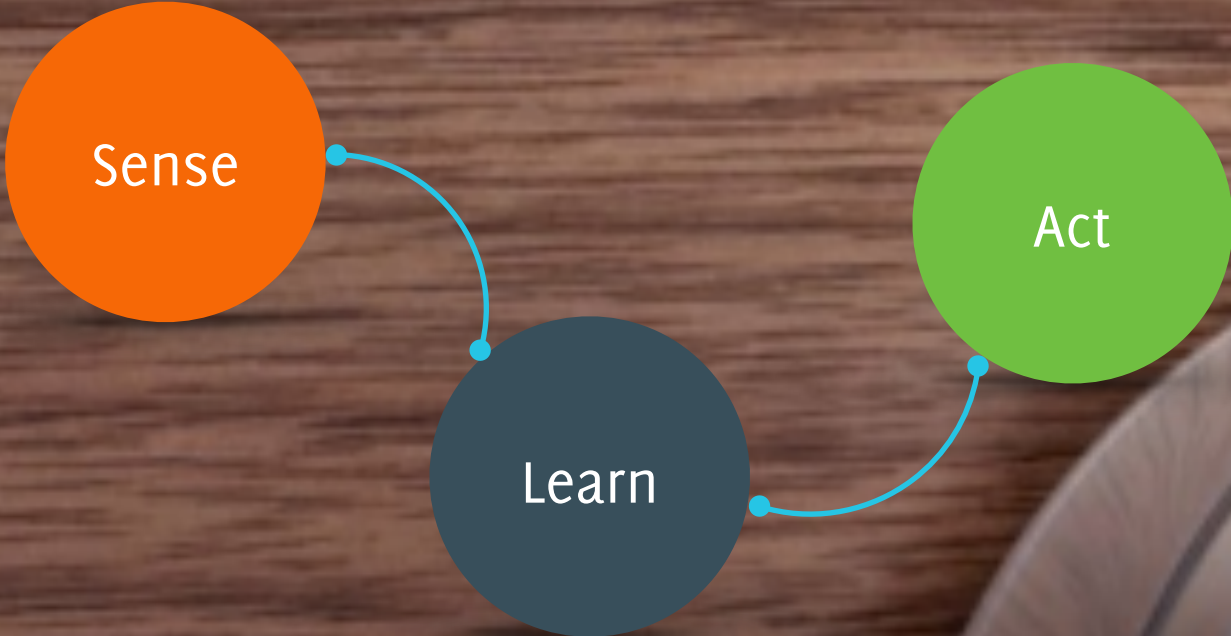






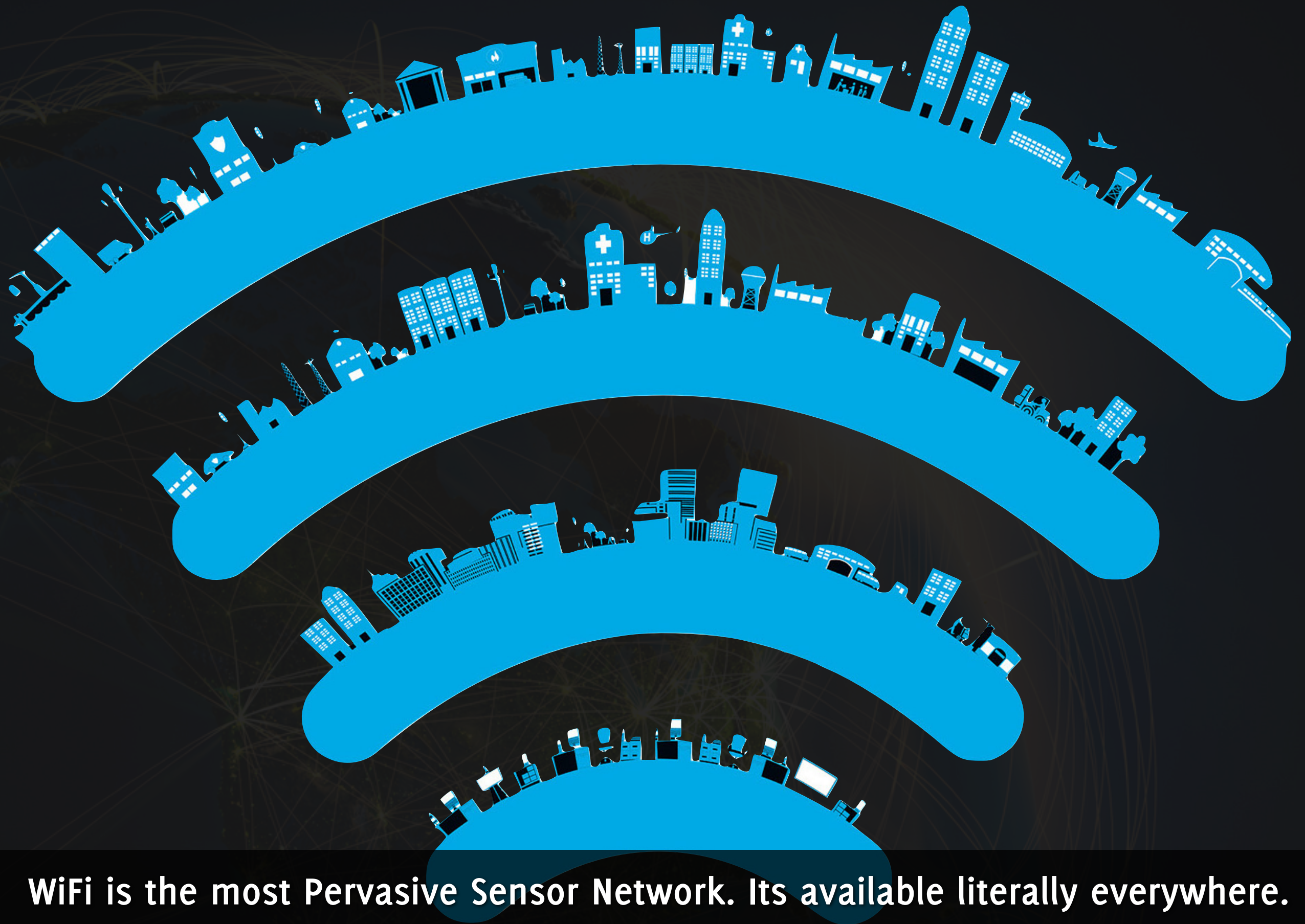
**If everything is connected why would you need a device?**





Zero Interaction and Zero UI





**WiFi is the most Pervasive Sensor Network. Its available literally everywhere.**



To what extent can we leverage existing wireless network as a platform for connected objects?

To what extent can we leverage existing wireless network to understand human behaviour?





People-Content  
Interaction



People-Object  
Interaction



People-People  
Interaction

Wireless network is the key fabric for designing connected human experiences





People-Object  
Interaction

People-People  
Interaction

## People-Content Interaction






Verizon   90%

10:43

Wednesday, October 2

 **TED** 13m ago  
New TED Talk: Data scientist Amy Webb didn't leave love up to chance. She reverse-engineered her online dating profile.  
*slide to view*

## Push Notifications





14:38

WHATSAPP

sophie charara:  
ARE YOU KID-  
DING ME?

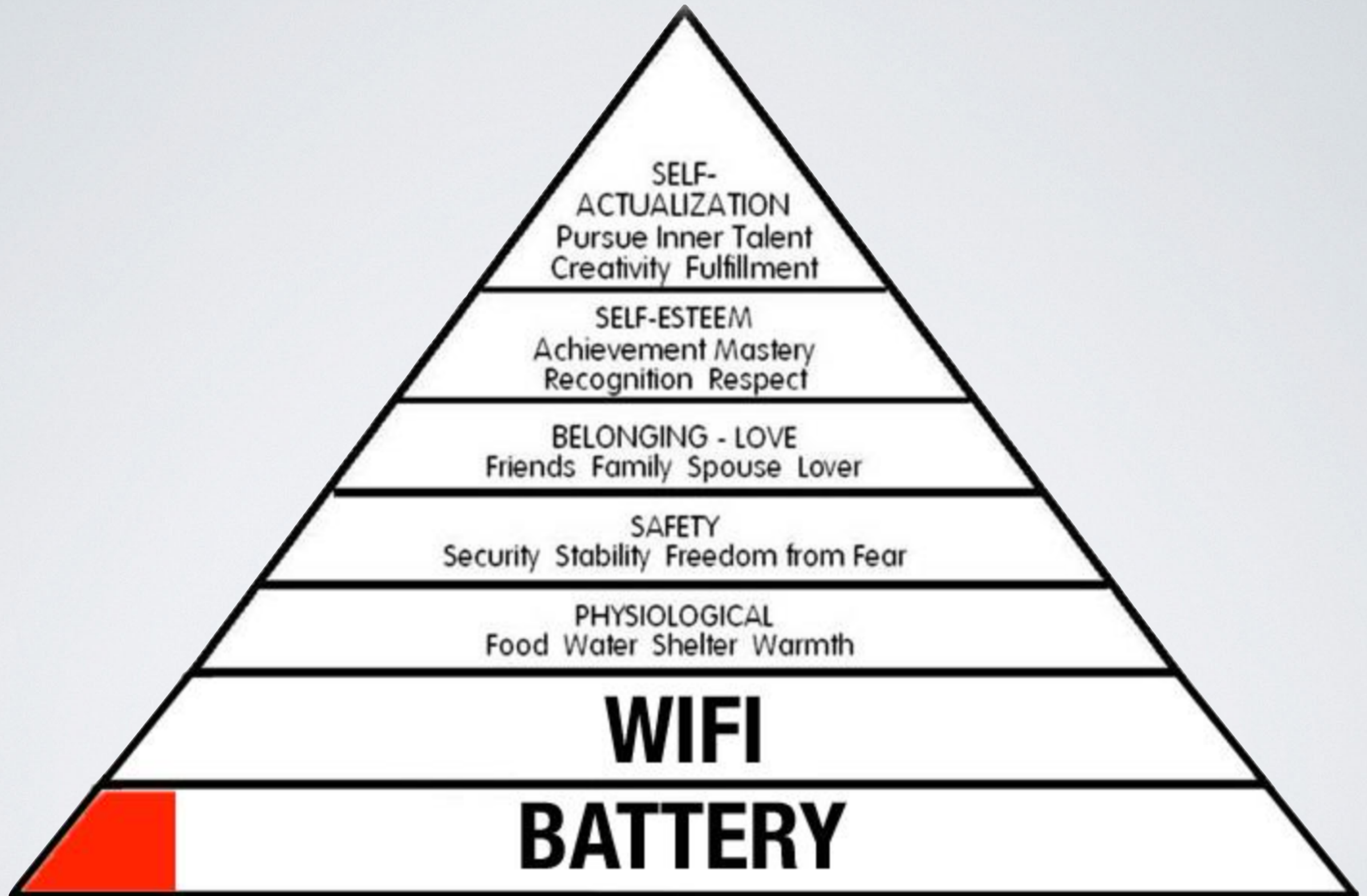
Dismiss





Clear All

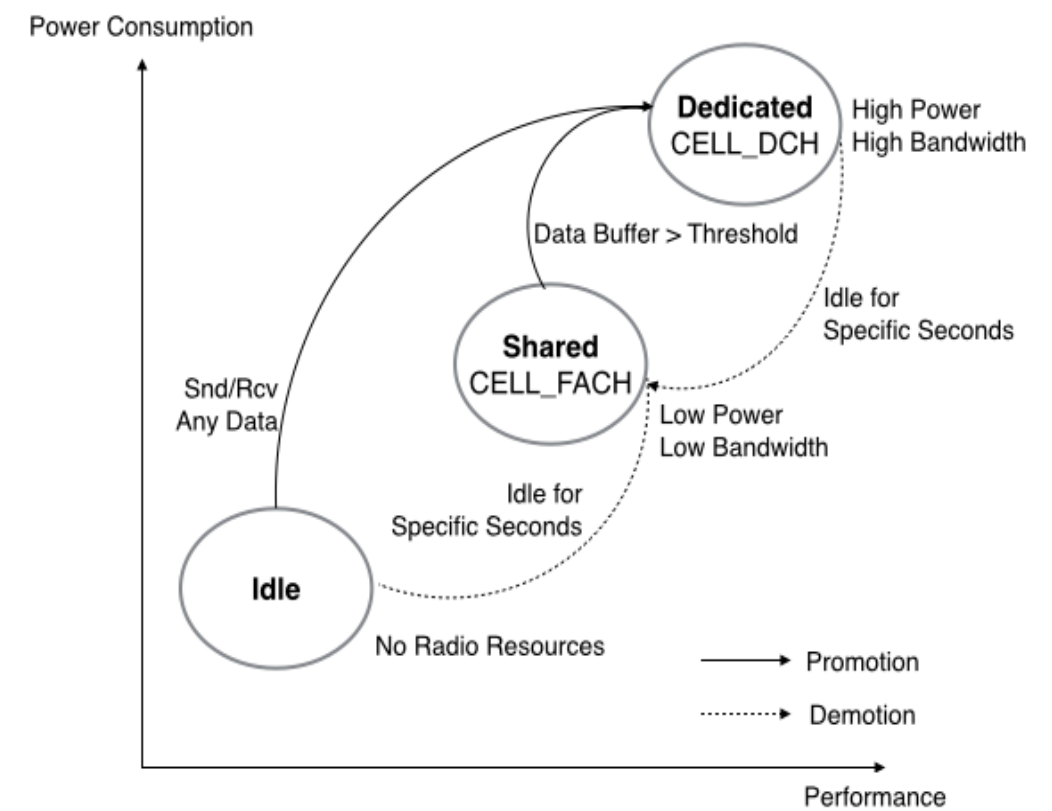
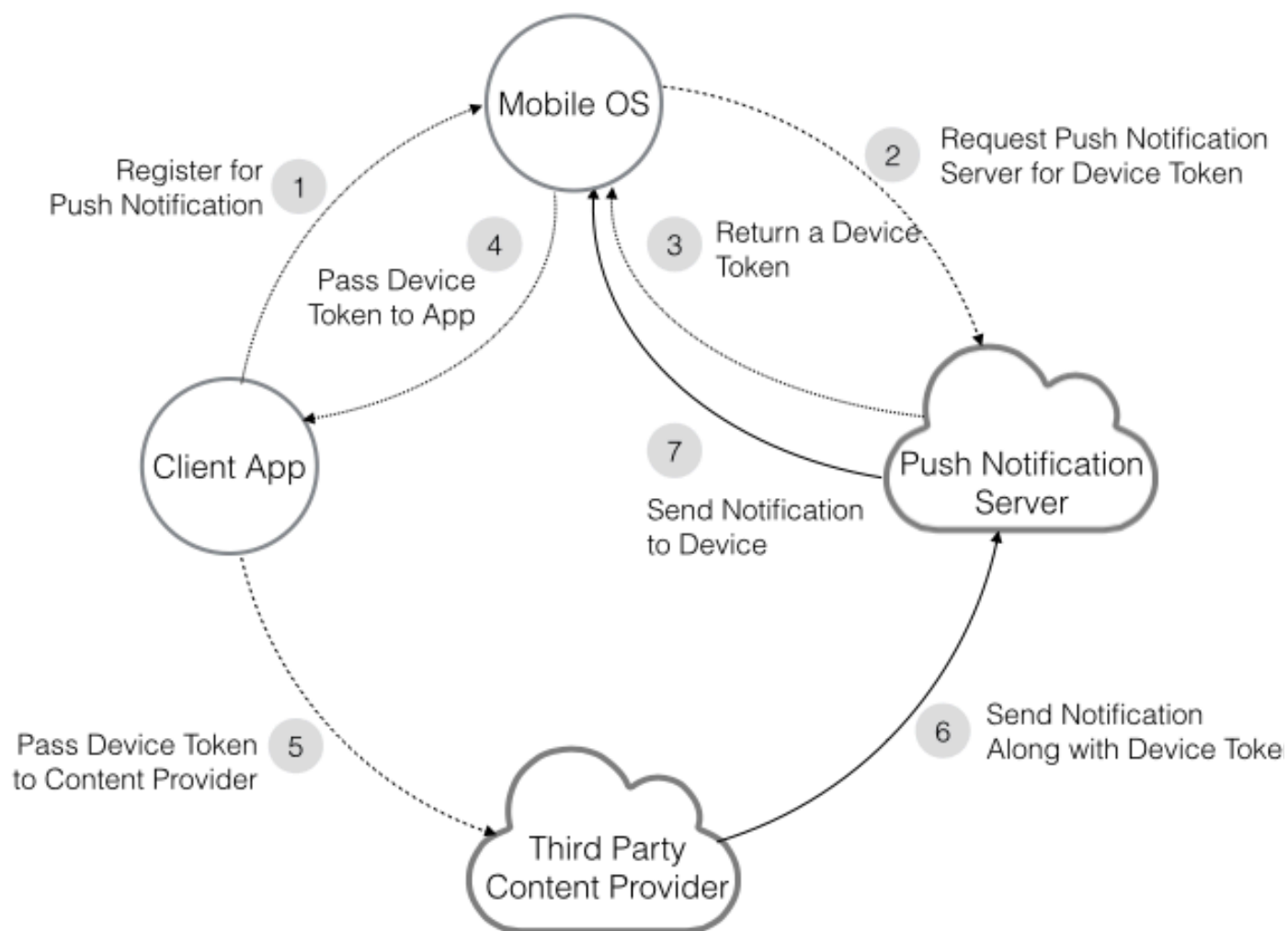






# Push Notification and RRC State Machine

A mobile device is in the CELL\_DCH state for a specific time period (which is called tail time) without any or small data transmission after a data session, and this tail time corresponds to **60%** of the total energy consumed by UE.

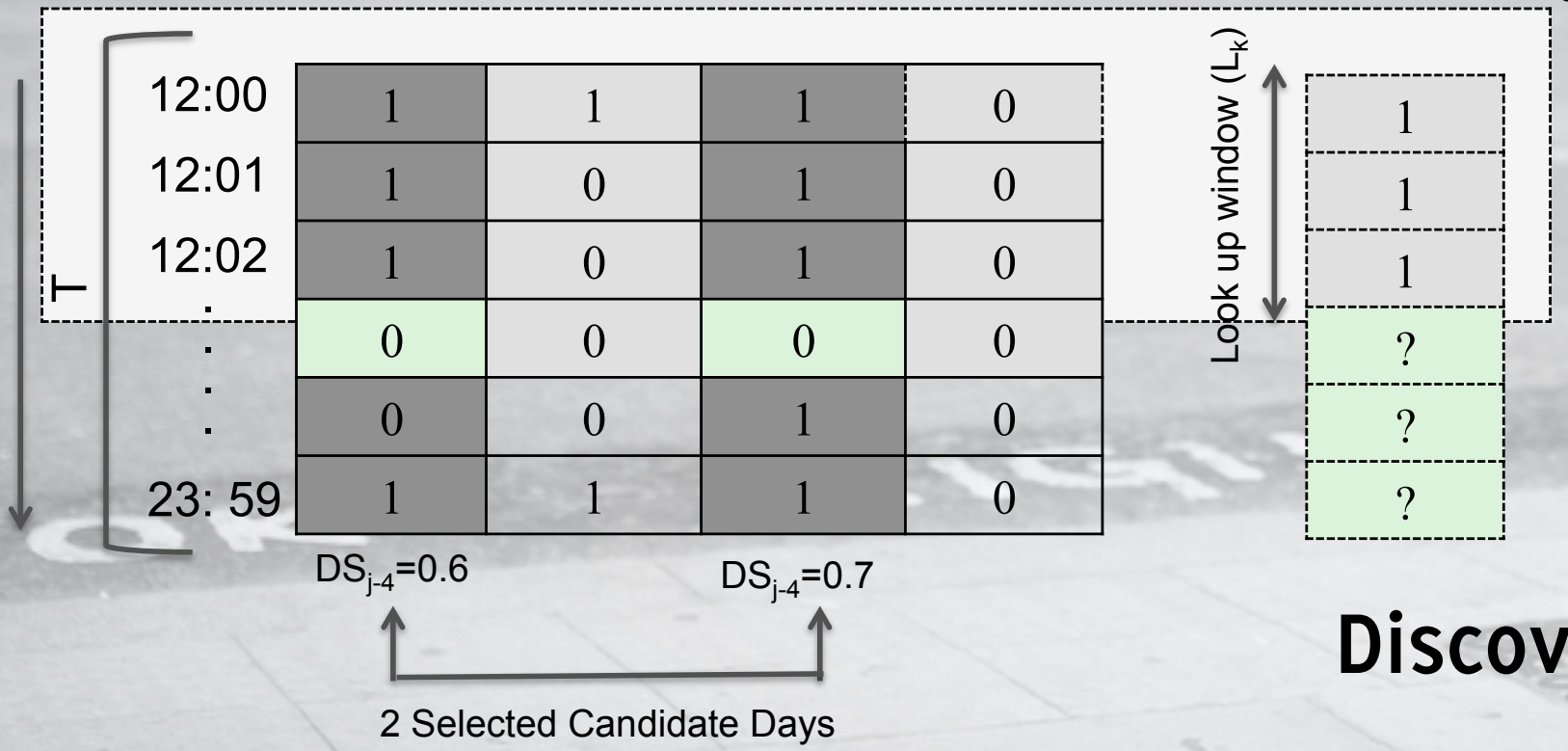
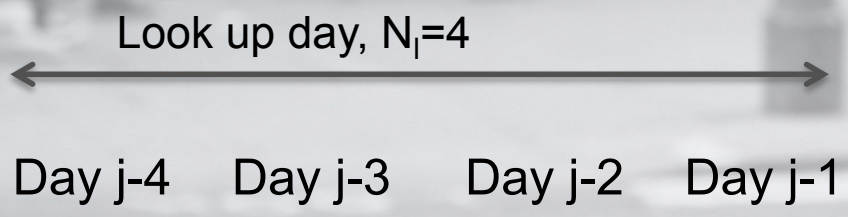






**Bringing the Network into the Story**

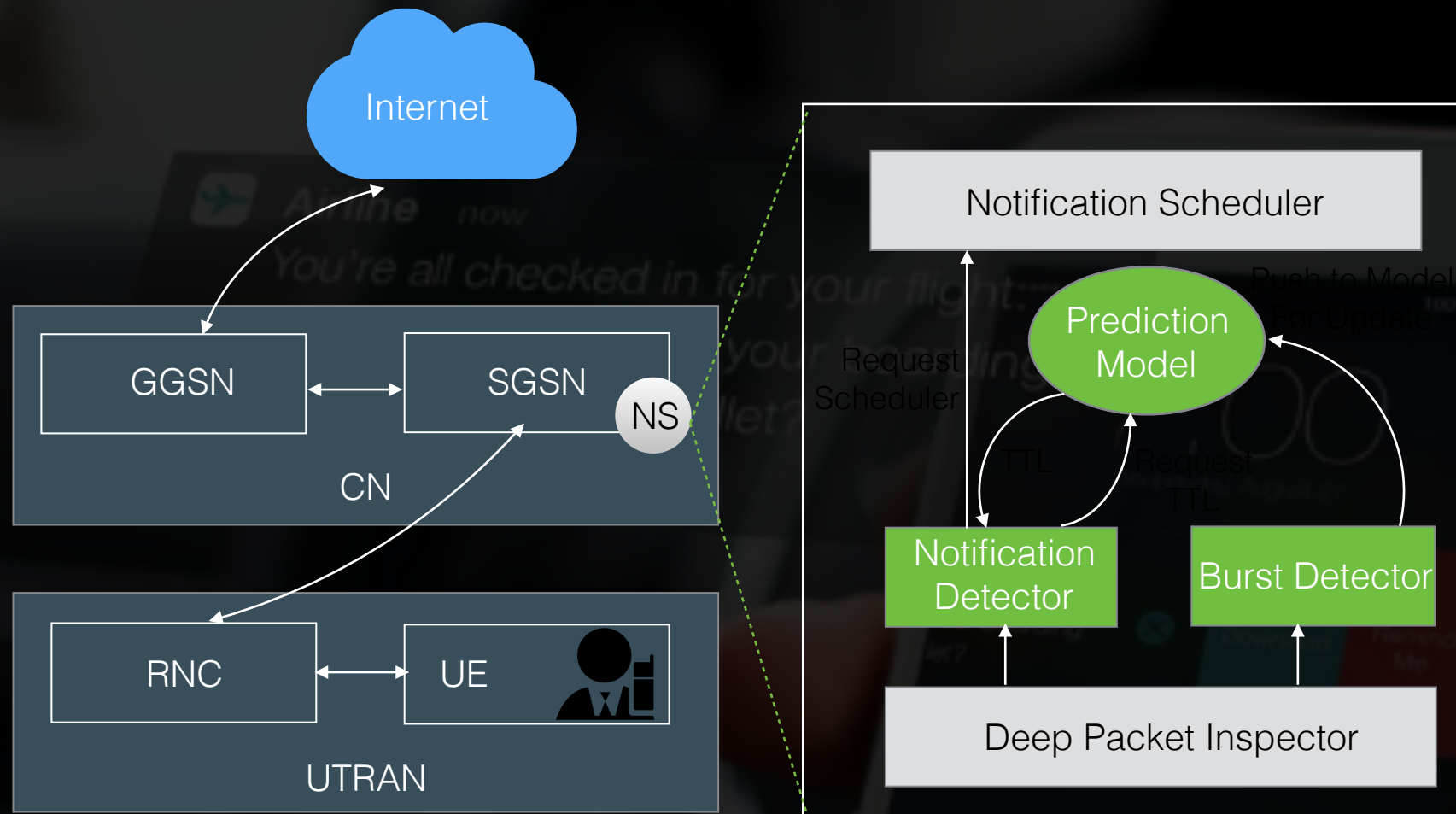




Over **75%** of network activity can be predicted with accuracy of over **80%**

## Discovering the Human Routine





Average latency is **157** seconds.

**±15%** energy can be saved by buffering notifications.





People-Content  
Interaction



People-Object  
Interaction

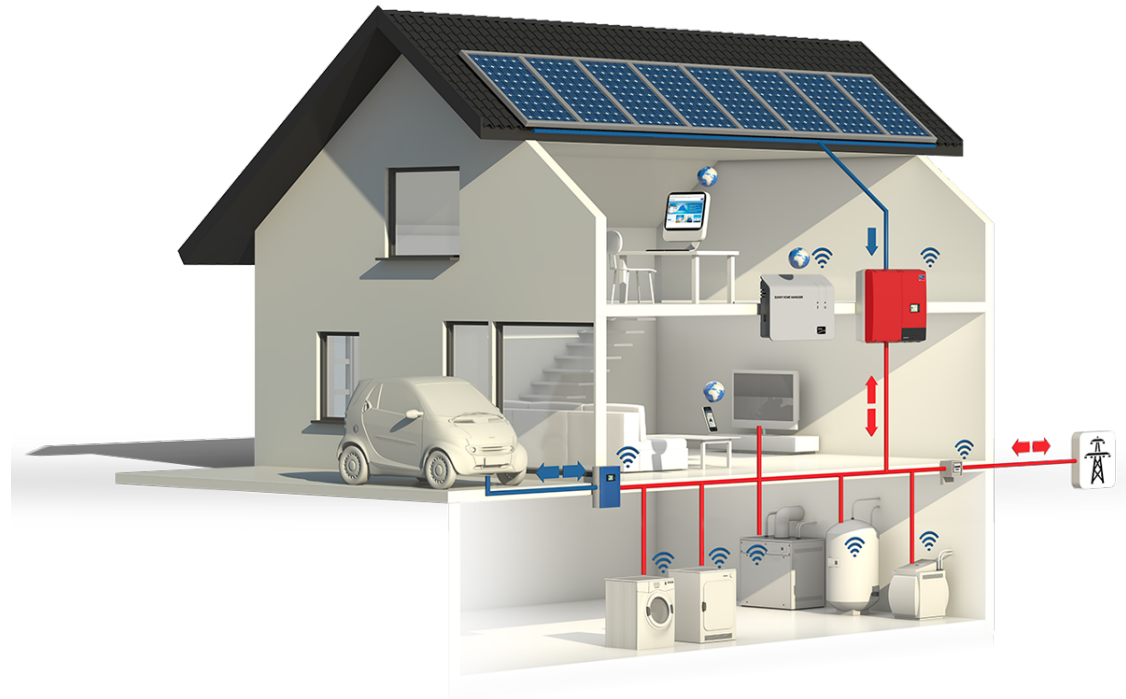


People-People  
Interaction

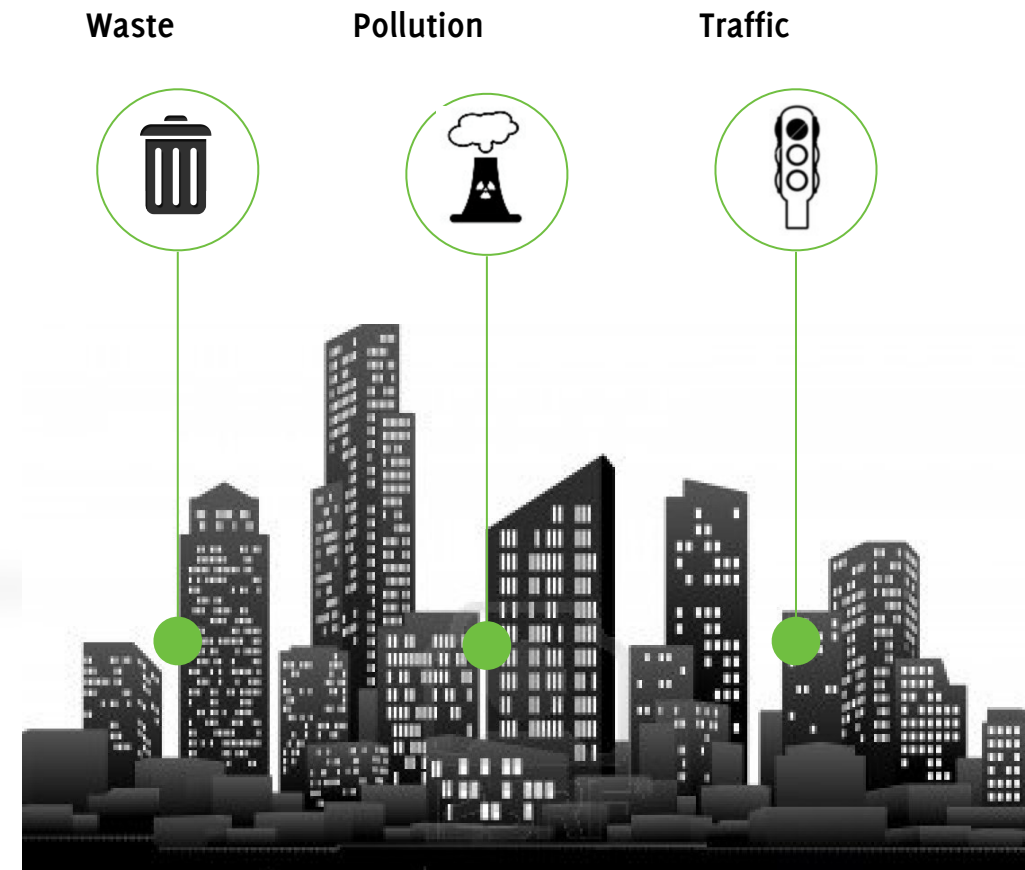




Quantified Self



Quantified Home



Quantified City



**Search** for physical objects' location and state is one of the basic services that provides foundation for many applications.





Dedicated Sensing Infrastructure (ZigBee, RFID, Mote, etc.)

- High deployment and management costs

Bluetooth Discovery with Smart Phone

- Search range is limited to the smart phones' proximity

What we learnt in the past





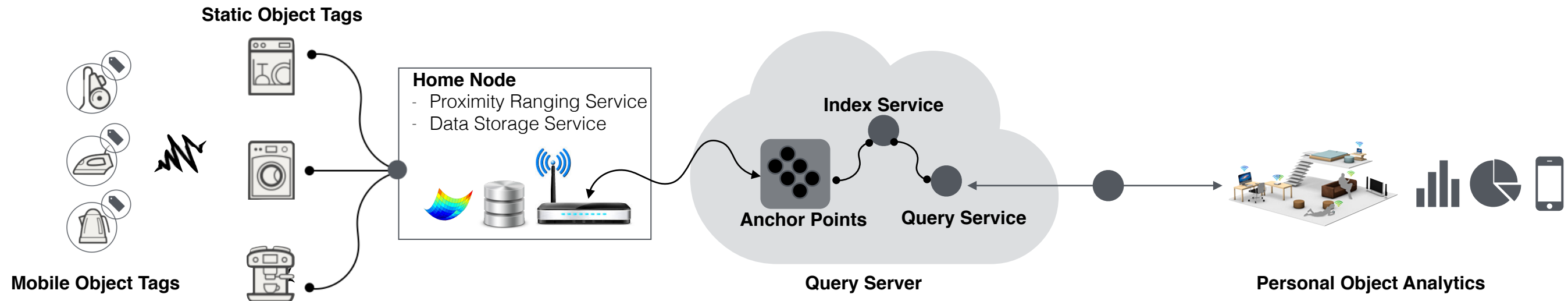
Can WiFi network be used as a platform for personal IoT analytics?

## Premise

Connected objects' movement data extracted from WiFi network signals carries vital information to model their spatio-temporal usage pattern



# System Architecture



## System Components

### Object Tags

Attached to physical objects and emit the location and state-of-use of the physical objects.

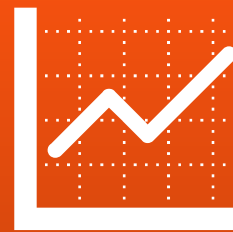
### Home Node

Hosted in the residential home gateways, provide proximity ranging service, and stores objects data.

### Query Server

Hosted in the cloud, maintains persistent connection with home node and provides query interface to personal analytics applications.





IoT Analytics

Prototype Personal IoT Analytics Application  
“Quantify the Spatio-Temporal Usage of Personal Object”



## Dashboard

- Shows realtime usage status (pointer up or down)
- Offers search capability



Things Dashboard



## Timeline View

- Offers recent spatio-temporal usage information

Locate and Query Physical Objects



## Insight View

- Offers aggregated spatio-temporal usage information



Realtime Insights on Spatio-Temporal Usage



# You Own Your Data, You Sell Your Data

- Our cloudlet based design scheme coupled with WiFi management frame based data transport offer implicit privacy and data protection as Data remains in the home gateway and this **provides users with the control of their own data to do whatever they want to do with them – delete, sell or share.**
- An advantage of these design schemes is that, it opens up opportunity for wilful monetisation of personal data

Gerd Kortuem and Fahim Kawsar "**Market-based User Innovation for the Internet of Things**"; Internet of Things 2010 Conference

Afra Mashhadi, Fahim Kawsar, and Utku Acer  
"**Human Data Interaction in IoT: The Ownership Aspect;**". The IEEE World Forum on Internet of Things 2014







People-Content  
Interaction



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People-People  
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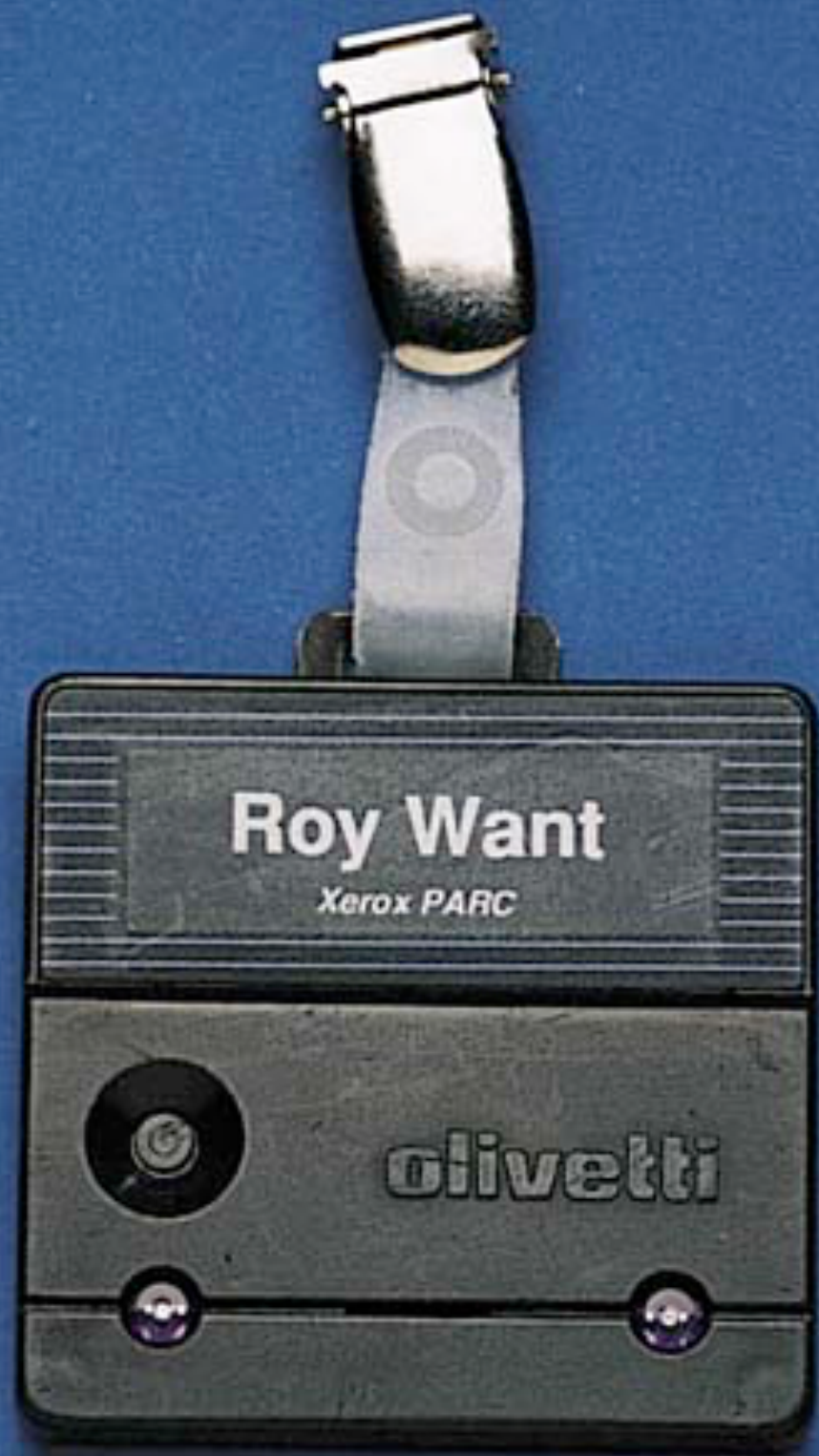
"Tiny Habits in the Giant Enterprise: Understanding the Dynamics of a Quantified Workplace". UbiComp 2015  
"Detecting Human Encounters from WiFi Radio Signals". MUM 2015





**Quantified Enterprise**





Active Badge - Xerox | Cambridge U





**That Privacy Thingy!**





Fil Dnsky  
<http://be.net/dnsky>





Happiness Badge - Hitachi



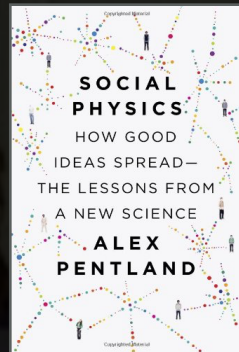
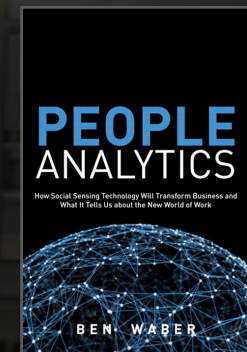


Sociometer Badge - MIT



# Spontaneous Interactions

## Key to Flow of Ideas



A third of team performance can be predicted merely by the number of **Face to Face** exchanges among team members.

The “data signature” of natural leaders can be discovered.

Daily Productivity and Creativity can be rightly assessed.



the  
**Linked**  <sup>®</sup>  
factor





“Only **4%** of large companies can make meaningful predictions about their workforces, while **90%** can accurately predict business metrics such as budgets, financial results, and expenses”

- Bersin Research



# Quantified Enterprise

Understand and quantify how people interact and work together in the real enterprise for personal, group and larger organisation efficiency.



Quantified Self



Quantified Team



Quantified Enterprise





## For Building Managers

- Predictive Maintenance
- Better Space Arrangement & Management
- Personalised Space Recommendation
- Better Resource Management

## For Employers

- Quantifying Collaboration
- Discover Emerging Leaders
- Build High Performance Team
- Develop Empathic Relationship

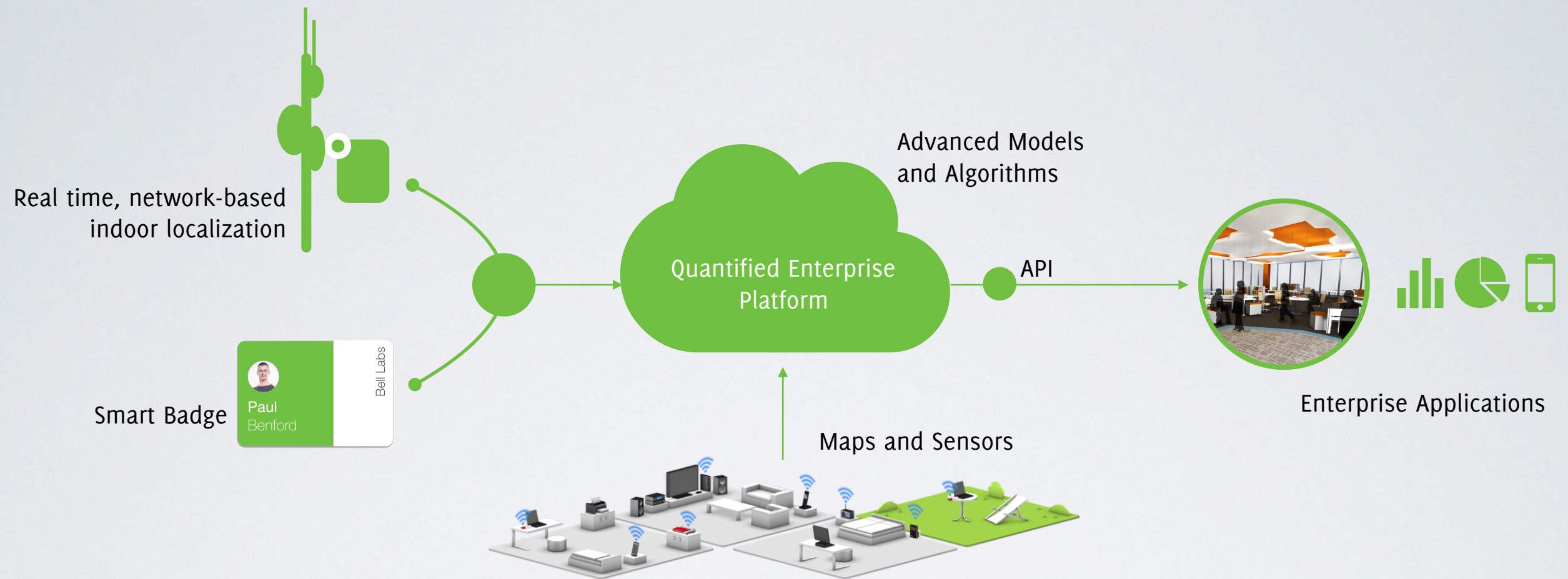
## For Employees

- Personal Interaction Reflection
- Personal Network Scale and Diversity
- Personal Time and Activity Management
- Personal Connection Extension

Implications



# A Network and Small Data Driven Solution

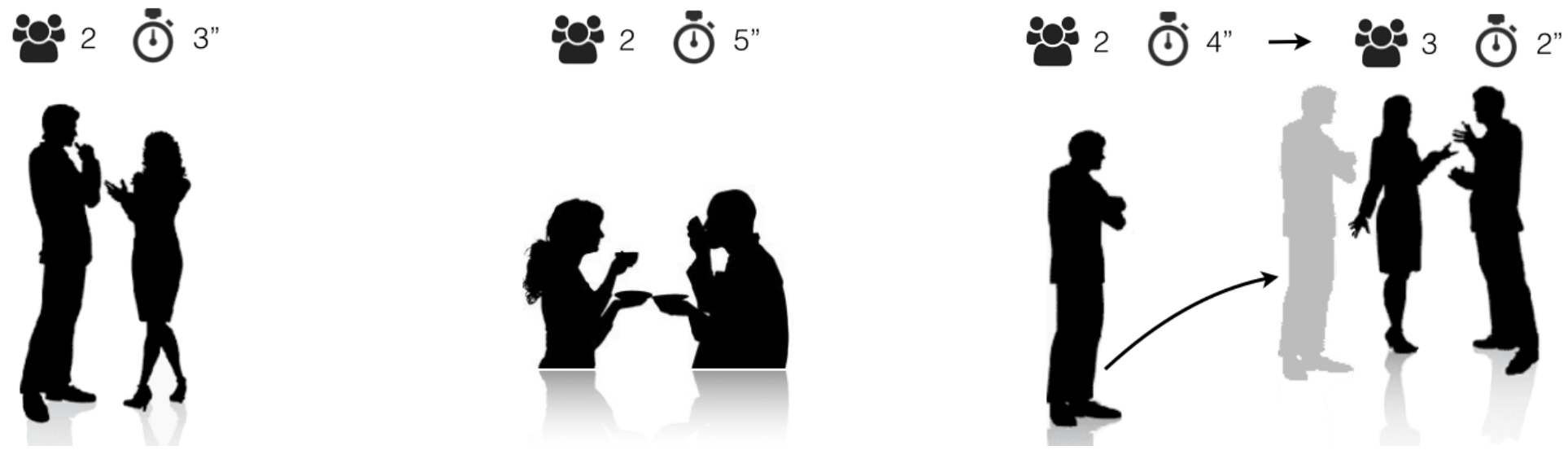


**50x** reduction in deployment and management cost

**30x** reduction in energy expenditure of mobile devices



# Location to Face to Face Interaction



A network-centric architecture that captures existing radio signals (WiFi probes) from the user's device.



Co-location detection based on similarity of wireless channel propagation characteristics.



An empirically defined model grounded upon sociology theories, by leveraging the size and duration of the encounter.

**60%** of Encounters Detected

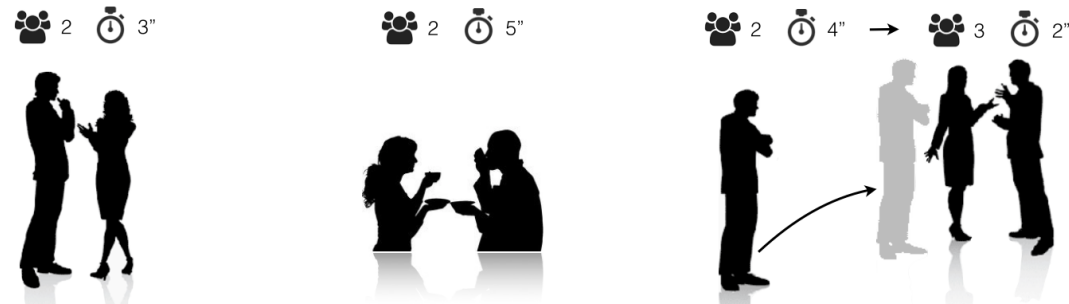
**90%** Accuracy (Precision)



# Behaviour Modelling

Extracting high order behavioural traits

## Location -> Face to Face Interaction



This has been used to build connectivity graph and show collaboration intensity in the application.

## Location -> Personality

F2F Encounter Diversity, Number, Frequency, regularity and Spatial Behaviour are used to extract Big Five Personality Traits

## Location -> Happiness

Spatial Behaviour and Movement Trajectory are used to estimate Physical Activeness and then map to mental wellbeing (baseline Happiness Index Survey)

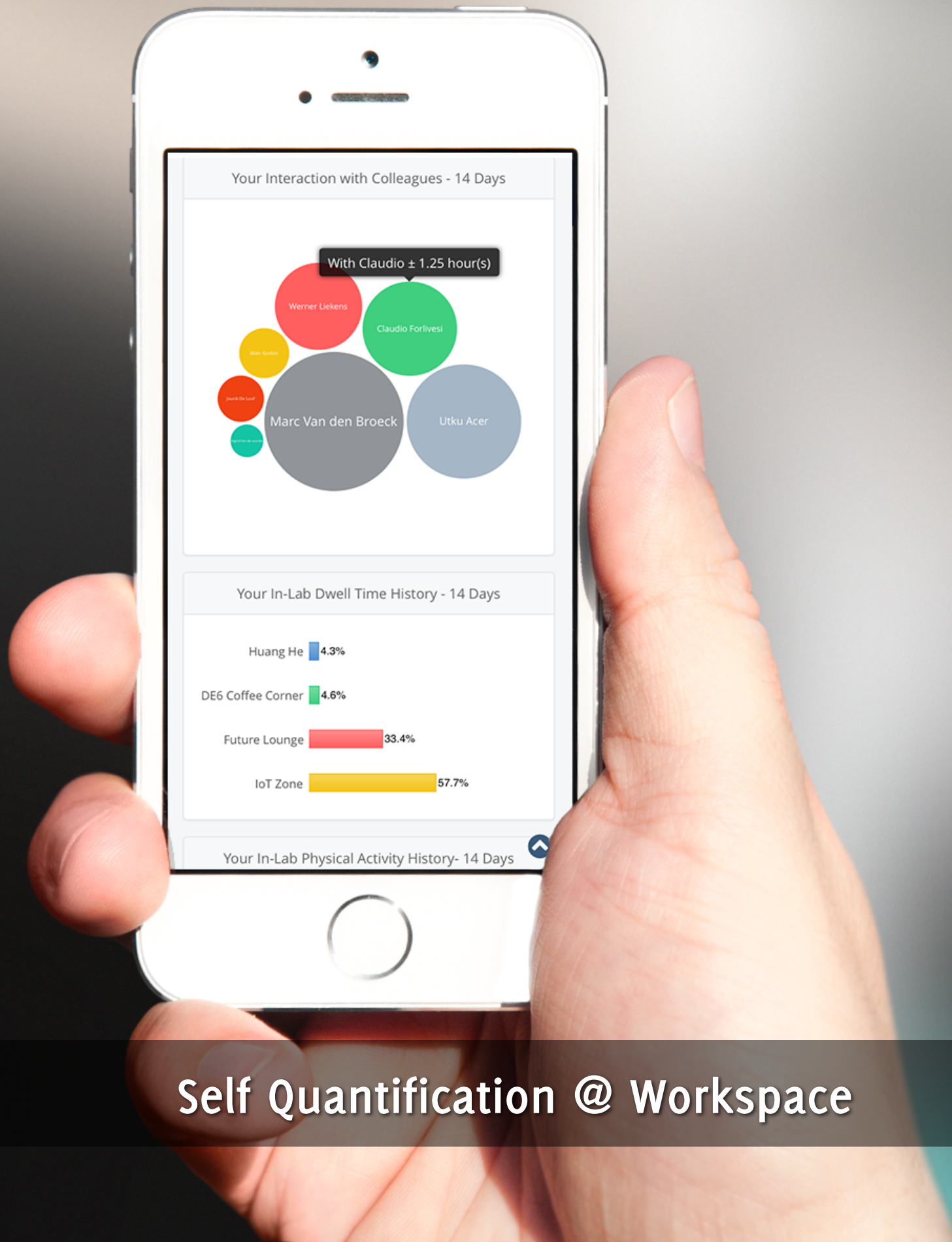




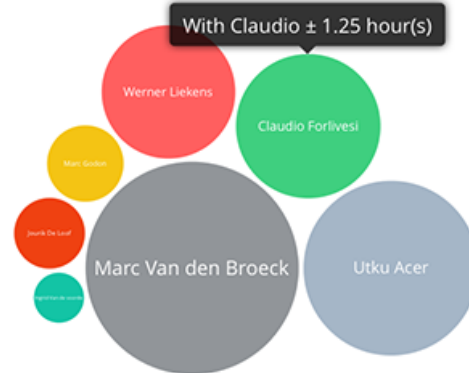
People  
Analytics

Personal Application Experience

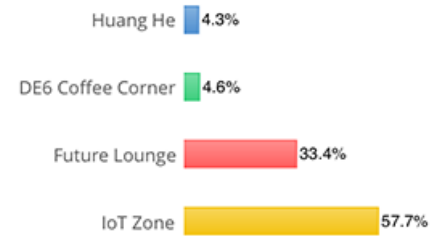




Your Interaction with Colleagues - 14 Days



Your In-Lab Dwell Time History - 14 Days



Your In-Lab Physical Activity History - 14 Days

Self Quantification @ Workspace





Paul Benford  
Your Recent Spontaneous Face to Face Interaction

Rose Jan 26, 14:45

Jan 26, 14:00 Kevin

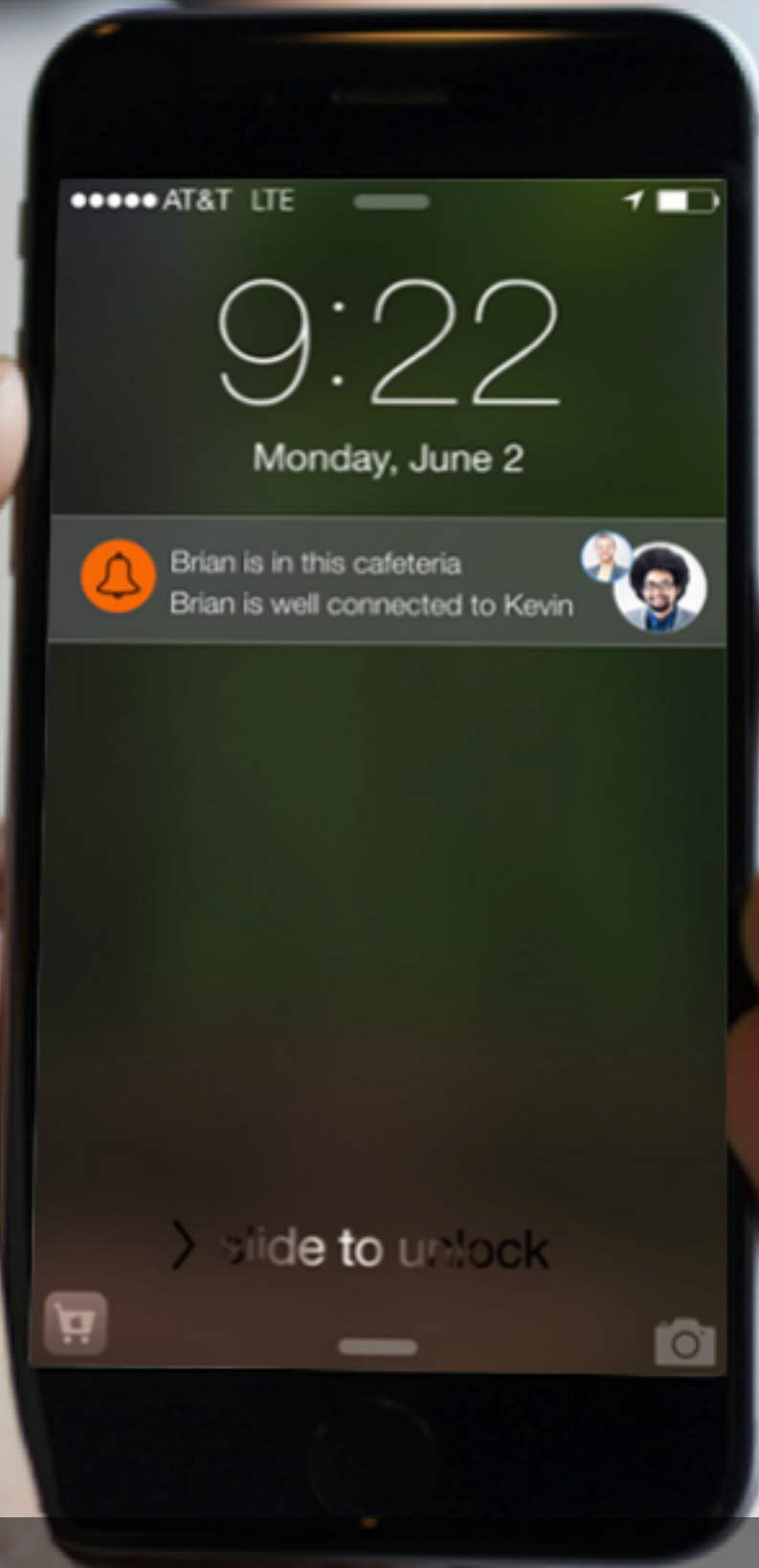
Peter Jan 26, 13:45  
Marc

Jan 23, 18:30 Kate

Koen Jan 23, 18:15

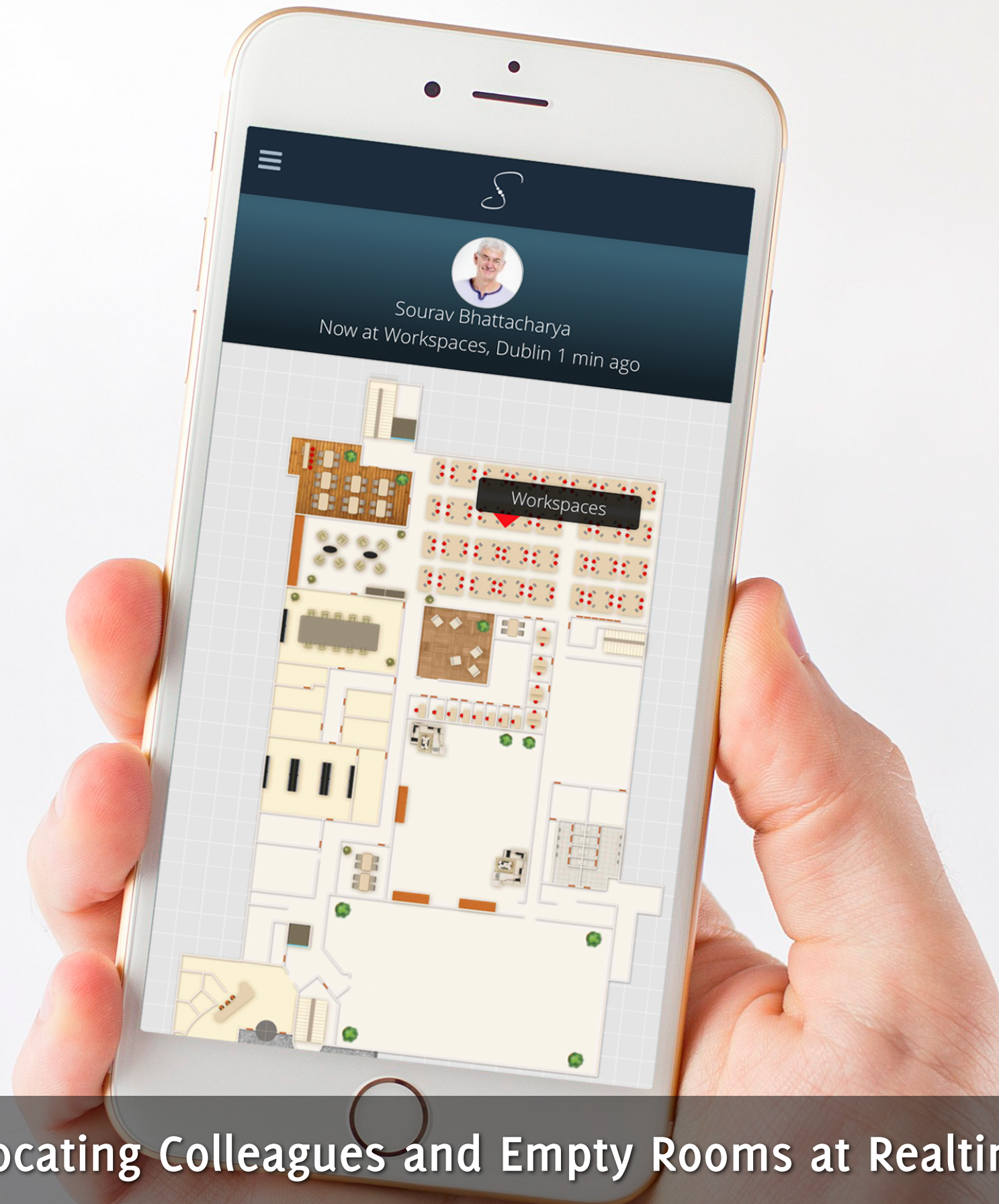
Timeline of Face to Face Interactions





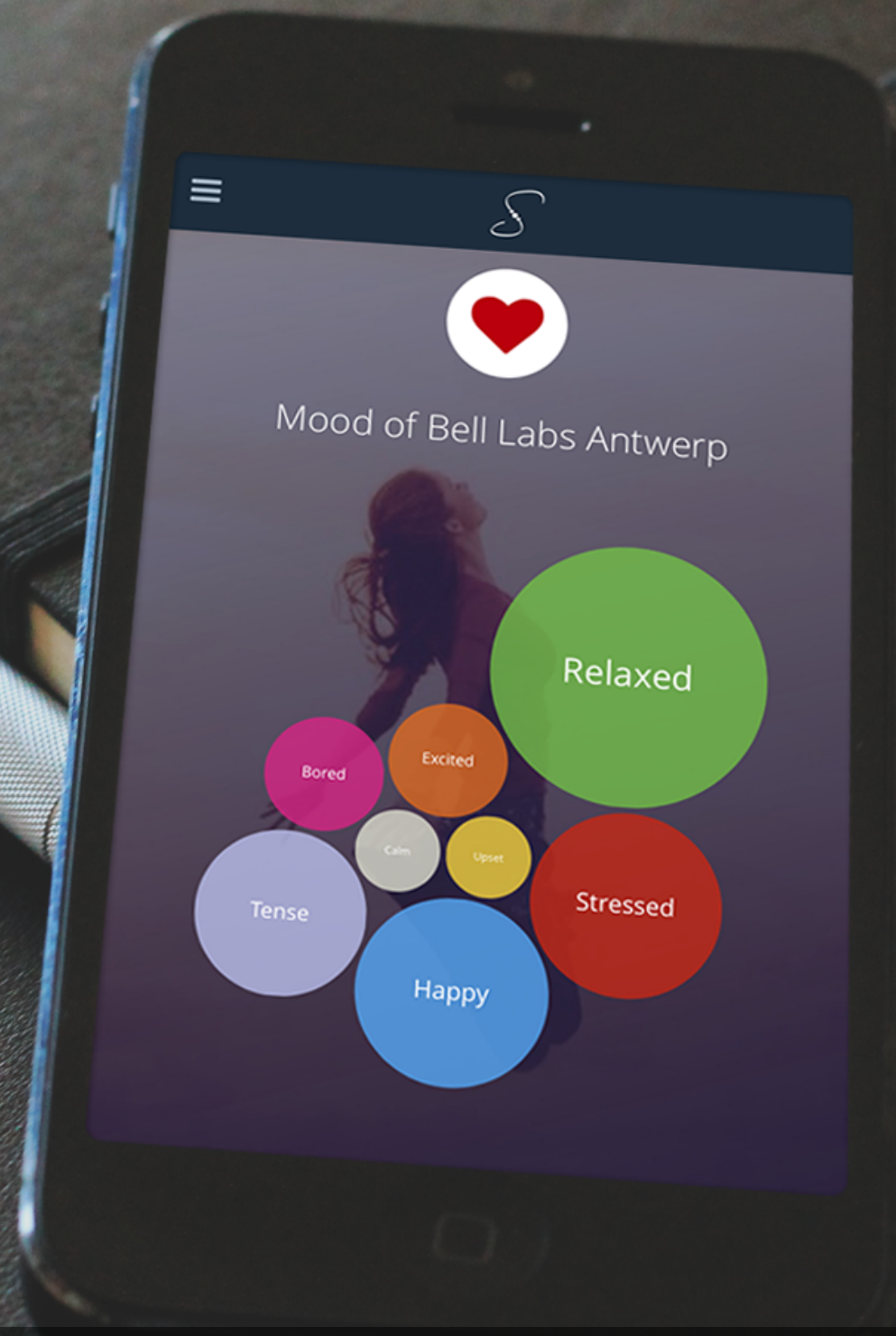
**Realtime Recommendation to New Contacts**





Locating Colleagues and Empty Rooms at Realtime





**Happiness Map of the Workspace**





Playful Visualisation of the Workplace Mood



# Collaboration Uncovered

Insights from Quantified Bell Labs (Dublin and Antwerp) Workplaces

## 3 Secrets Revealed



Its all about  
Relationship

Key to Engagement is the visualisation of the relationship structure



Subtle Hints

Users awareness of their collaboration nature is crucial, however presentation needs to be subtle but meaningful



Recommend  
Opportunities

Users are willing to compromise their privacy when the value is higher. Recommendations of right opportunities are key to create that value



Credit goes to ...



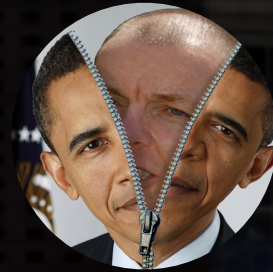
Claudio Forlivesi



Utku Acer



Geert Vanderhulst



Marc Van Den Broeck



Marc Godon



Afra Mashhadi



Akhil Mathur



Nic Lane



Sourav Bhattacharaya



Aidan Boran



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**Thank You**