

# WILL: Wireless Indoor Localization Without Site Survey

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# Outline

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- ▣ Background
- ▣ Overview
- ▣ System Design
- ▣ Evaluation
- ▣ Limitations and Discussion
- ▣ Conclusions

# Background

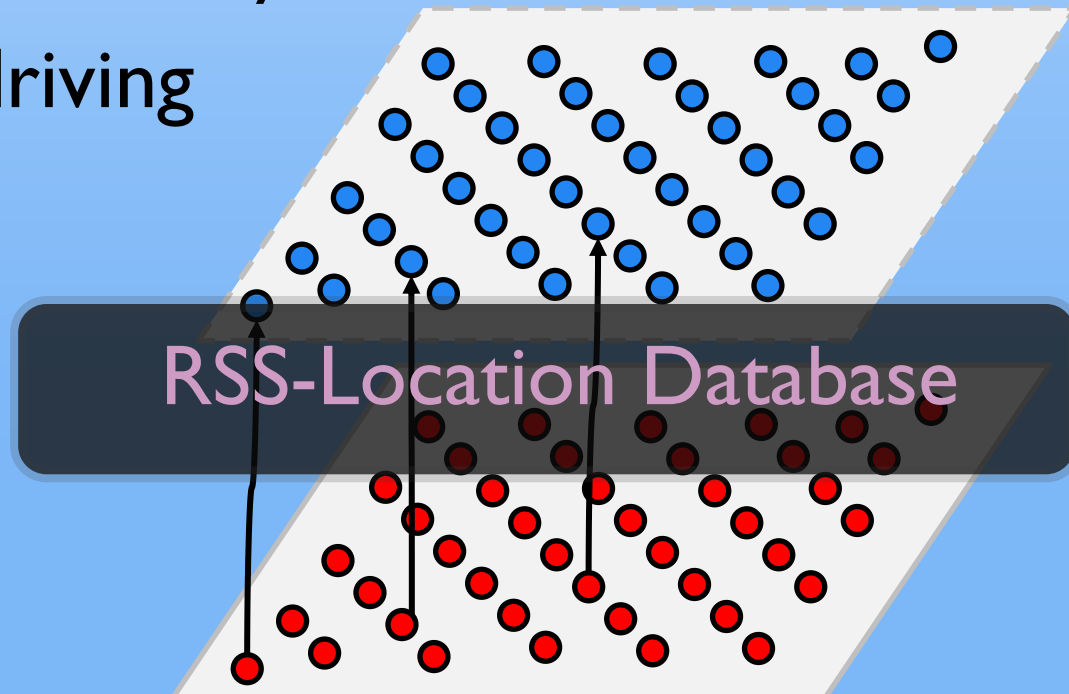
The background features a soft-focus landscape of rolling mountains under a hazy sky. A horizontal bar with a dark blue base and four colored segments (light blue, green, orange, and dark blue) is positioned across the middle of the image.

# Motivation

- ▣ Location, Location, Location!
- ▣ Indoor localization is widely studied.
  - ▣ Model-based methods
    - ▣ ARIADNE (Ji et al 2006), EZ(Chintalapudi et al 2010), etc.
  - ▣ Fingerprinting-based methods
    - ▣ RADAR(Bahl et al 2000), Horus,(Youssef et al 2008)  
LANDMARC(Ni et al 2004), SurroundSense(Azizyan et al 2009), etc.
    - ▣ Ekahau, Skyhook

# Motivation

- ▣ Limitations
  - ▣ Model: Require extra infrastructure, inaccurate
  - ▣ Fingerprinting: Need RSS-location database, which is usually built by site survey.
- ▣ Site survey / War-driving
  - ▣ Time-consuming
  - ▣ Labor-intensive



# Logical Localization

- Small physical errors result in large logical mistakes!

WILL: Wireless Indoor Logical Localization  
Without Site Survey



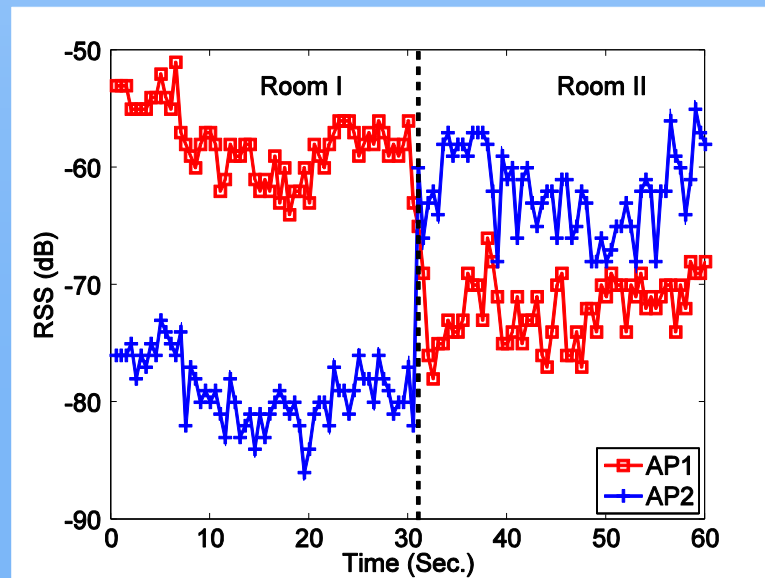
# Overview



# Key Insights

## ▣ Insights (I)

- ▣ Wall-penetrating effect: Signals may encounter a considerable abrupt change while passing through a wall

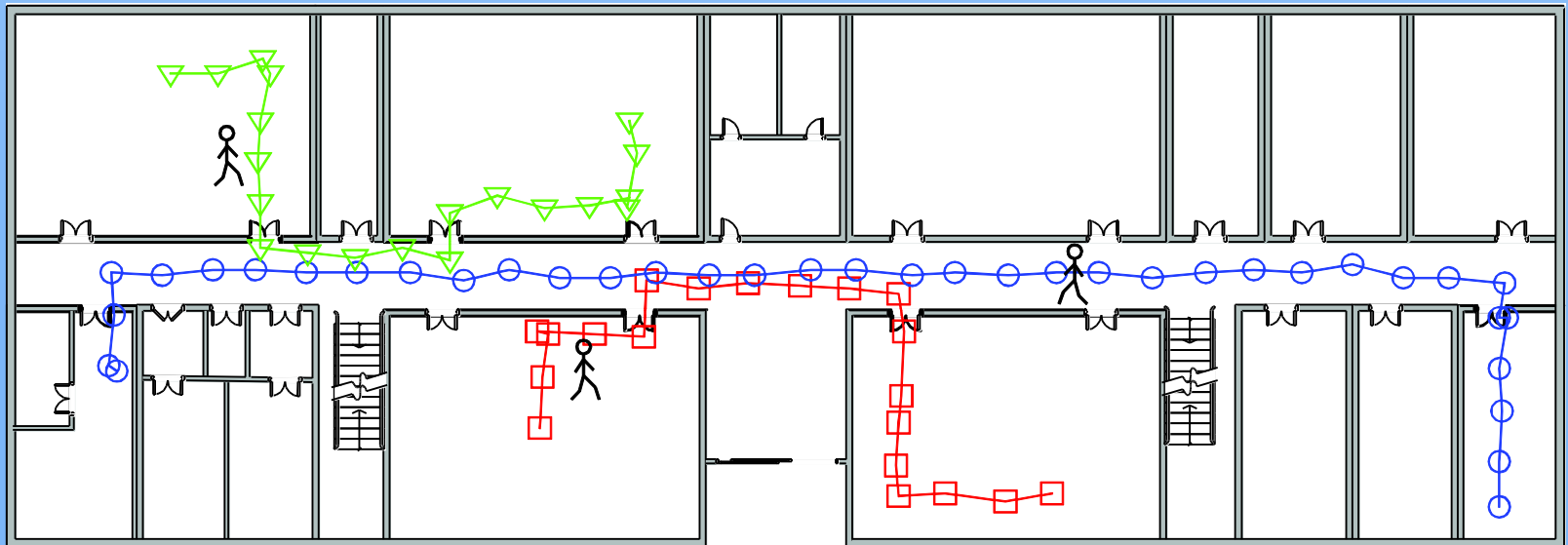




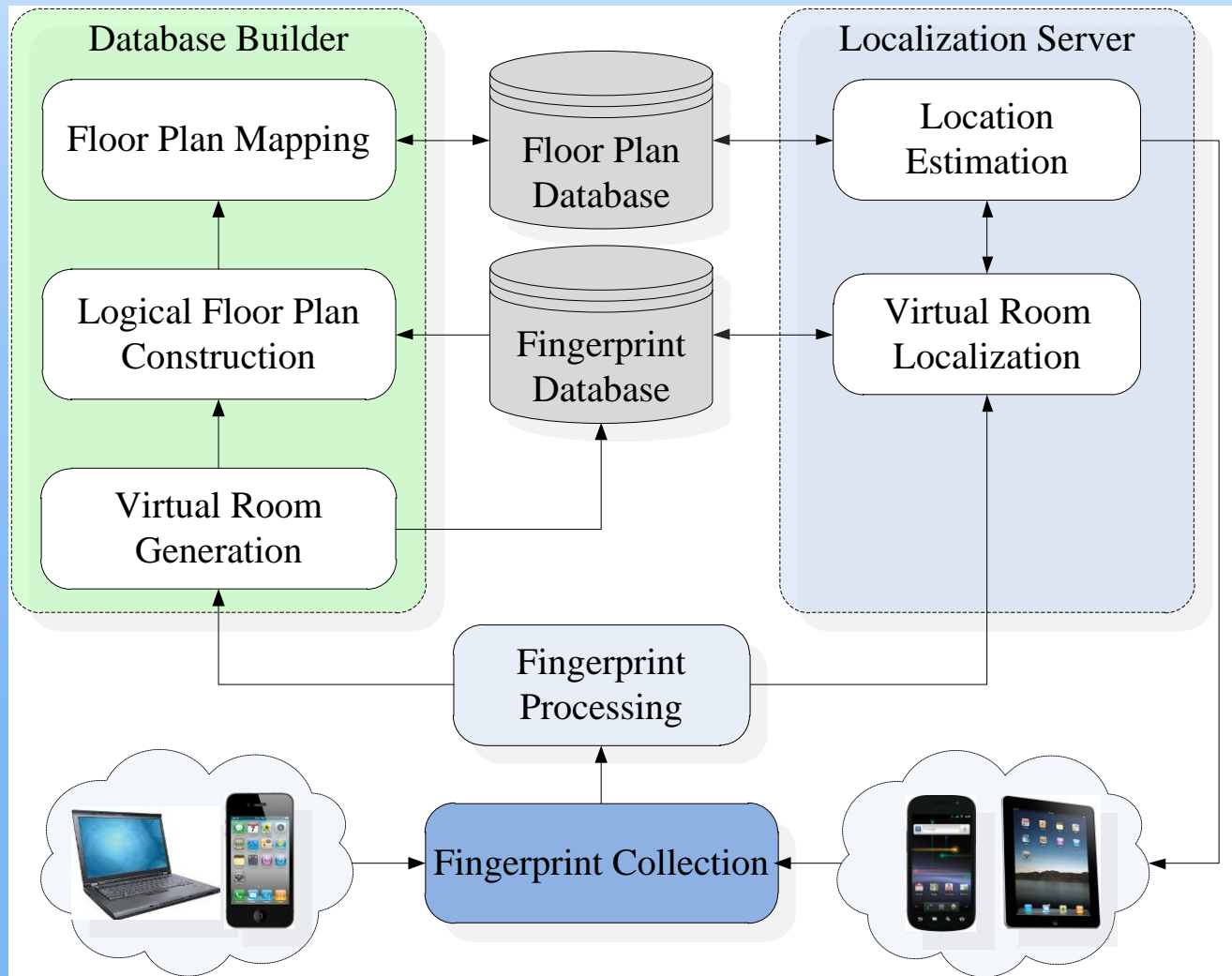
# Key Insights

## ▣ Insights (2)

- ▣ Considering user movements (collected from mobile phone), originally separated RSS fingerprints are spatially connected under certain semantics.



# System Architecture

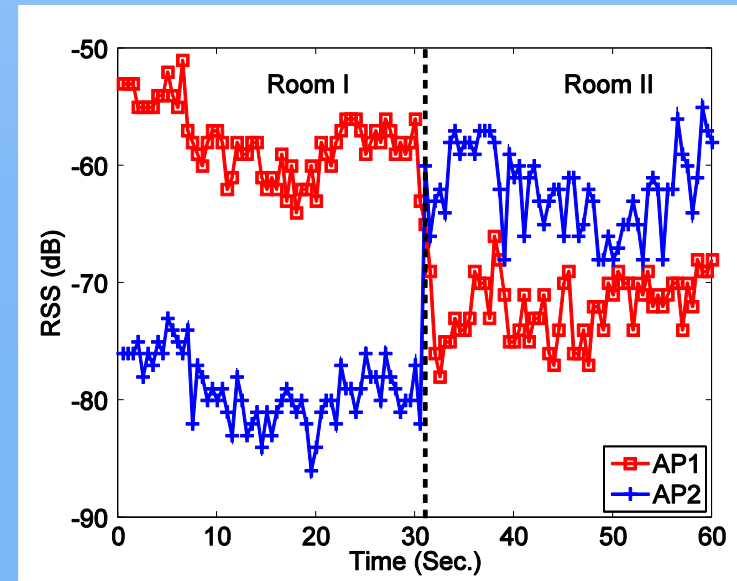


# System Design

A horizontal bar spanning the width of the slide, divided into five colored segments: dark blue, light blue, green, orange, and dark blue.

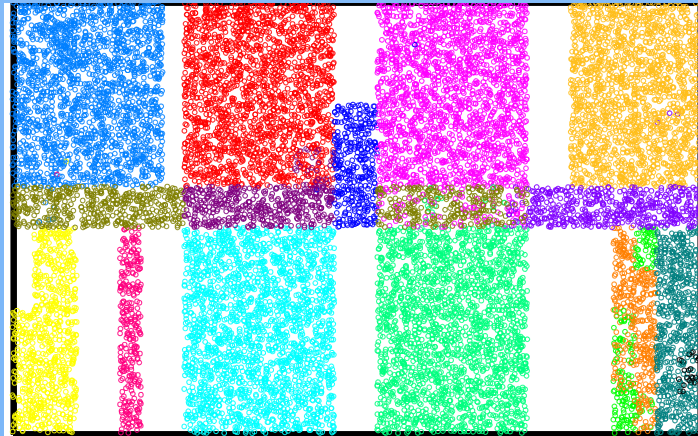
# Virtual Room Generation

- Fingerprint Collection
  - Collect information through mobile phones
  - Participants are unaware of the collection.
- Fingerprint Feature
  - RSS stacking difference
    - RSS varies over time
    - Staking difference maintains



# Virtual Room Generation

- ▣ Virtual Rooms
  - ▣ Generated by clustering fingerprints
  - ▣ Each cluster is a virtual room
- ▣ Virtual Room Update
  - ▣ Each room has a representative fingerprint  $F[R]$  and a dissimilarity threshold  $\xi$

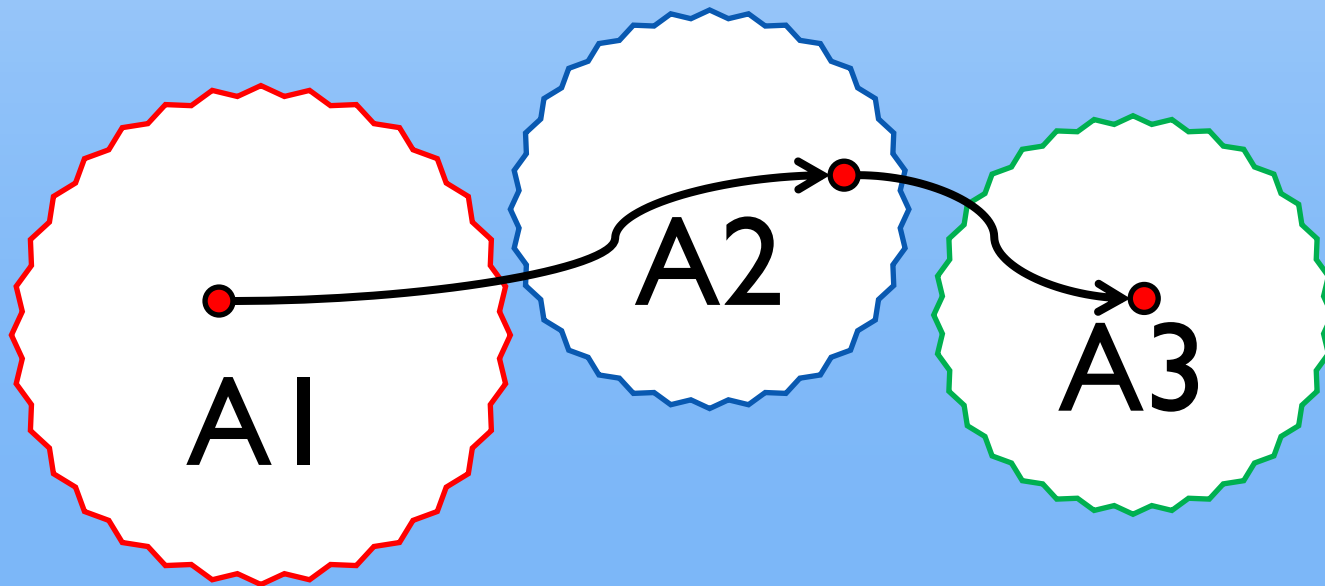


# Logical Floor Plan

- ▣ A **unique** component of WILL
- ▣ A logical floor plan is a diagram showing the view of the **reachability** among virtual rooms
- ▣ Logical graph  $P = (V, E)$ 
  - ▣  $v \in V$  denotes a virtual room and
  - ▣  $e = (u, v) \in E$  indicates virtual room  $u$  and  $v$  are reachable.
- ▣ How to construct it without location knowledge of virtual rooms?

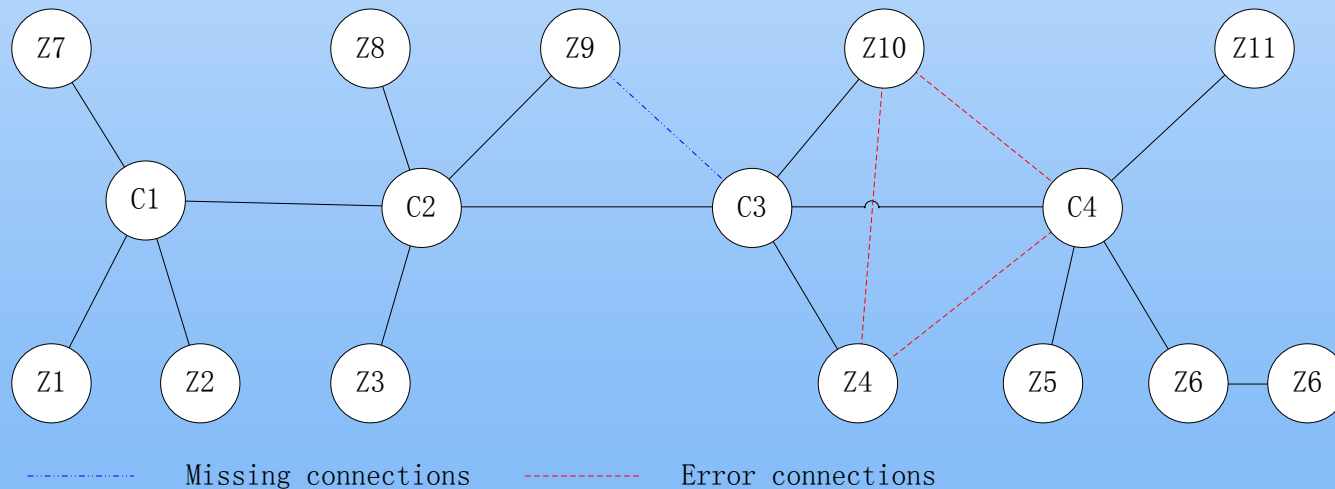
# Logical Floor Plan

- ▣ Using user movements!
  - ▣ Movements natively indicate reachability.



# Logical Floor Plan

## ▣ Logical floor plan (logical graph)



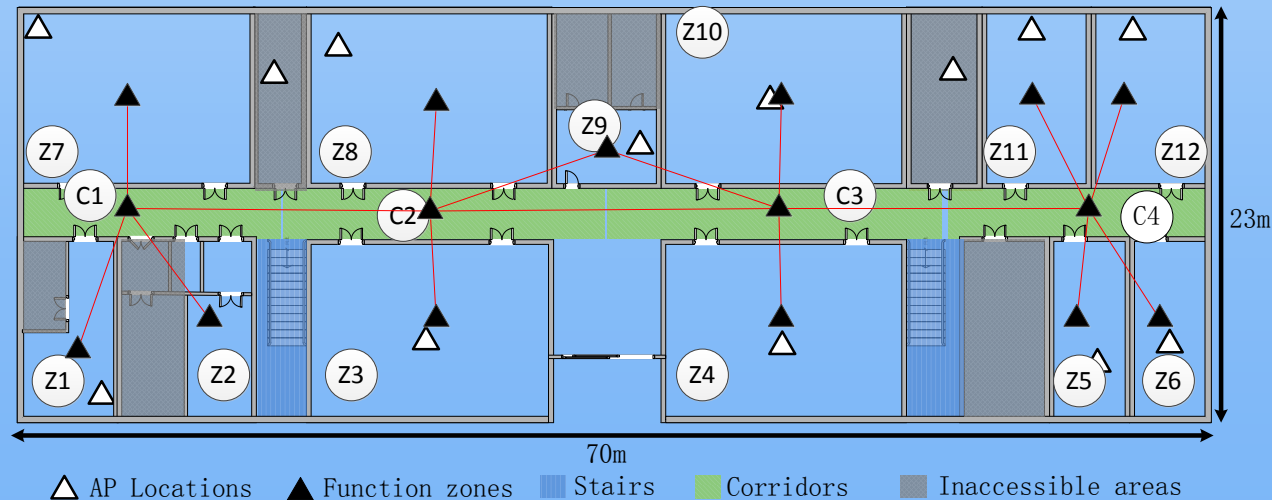
## ▣ Recall the biggest challenge:

- ▣ How to get the RSS-location associations?



# Floor Plan Mapping

- Map the logical floor plan to the physical one!
- Physical floor plan  $\rightarrow$  physical graph

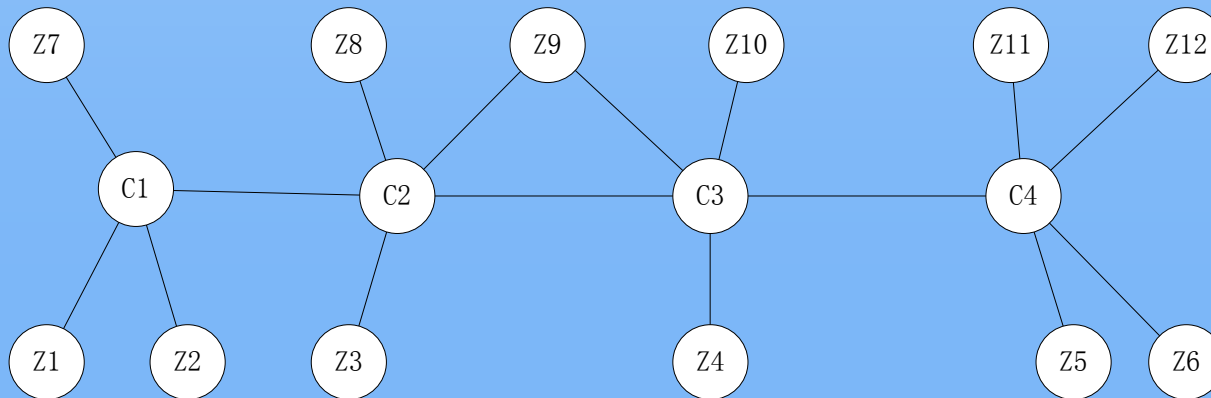
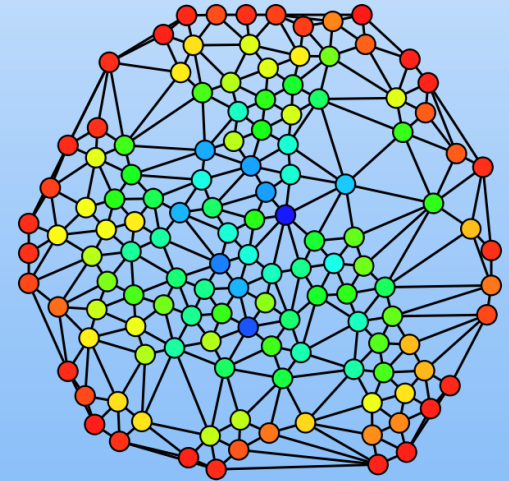


# Floor Plan Mapping

- ▣ How to map?
- ▣ Subsection Mapping Method (SSMM)
  - ▣ Skeleton mapping: Recognize central vertices (corridors)
  - ▣ Branch-knot mapping: Mapping branch vertices (rooms)
  - ▣ Correction

# Floor Plan Mapping

- Skeleton mapping
  - Recognize corridor vertices using *Betweenness centrality*.

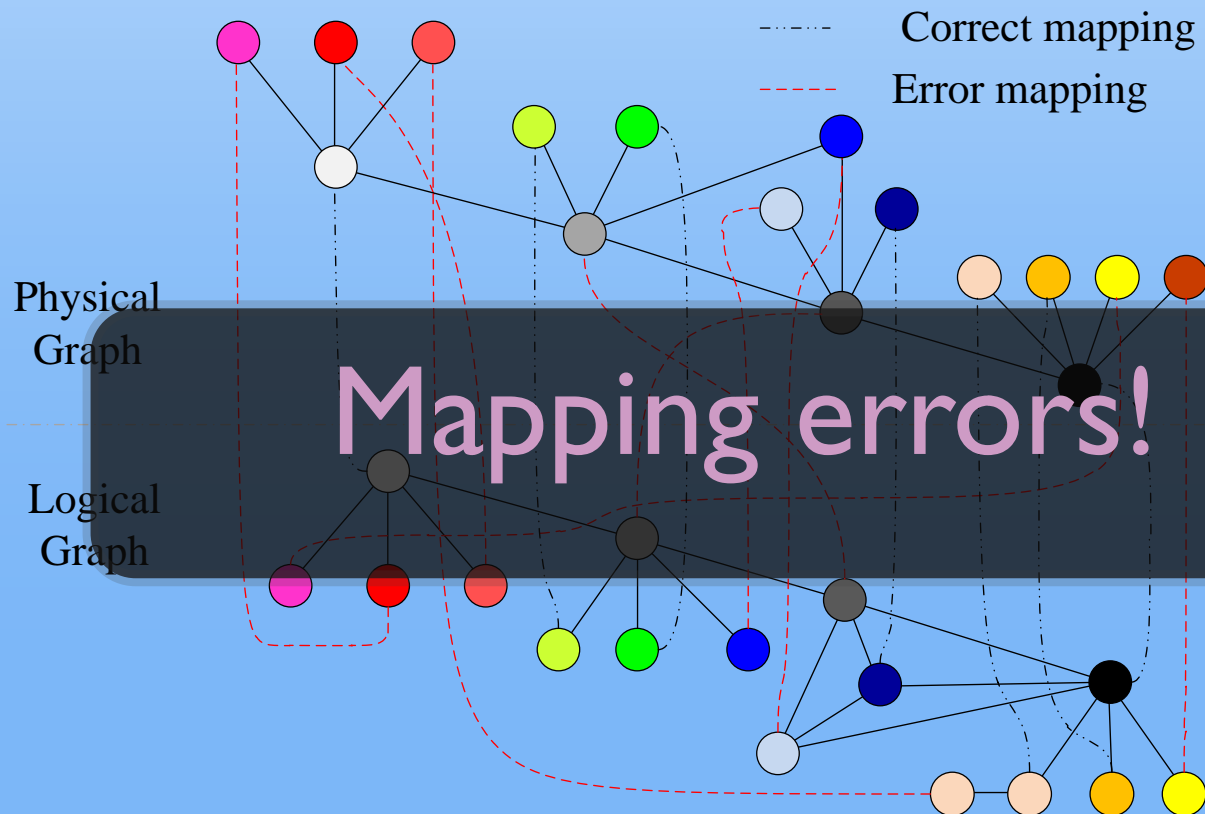


# Floor Plan Mapping

- Branch-knot mapping
  - Weight each vertices with the sum of all shortest paths
  - Mapping goal: minimize the total weight difference
  - *Weighted minimum bipartite matching (Kuhn-Munkras algorithm, i.e., KM)*

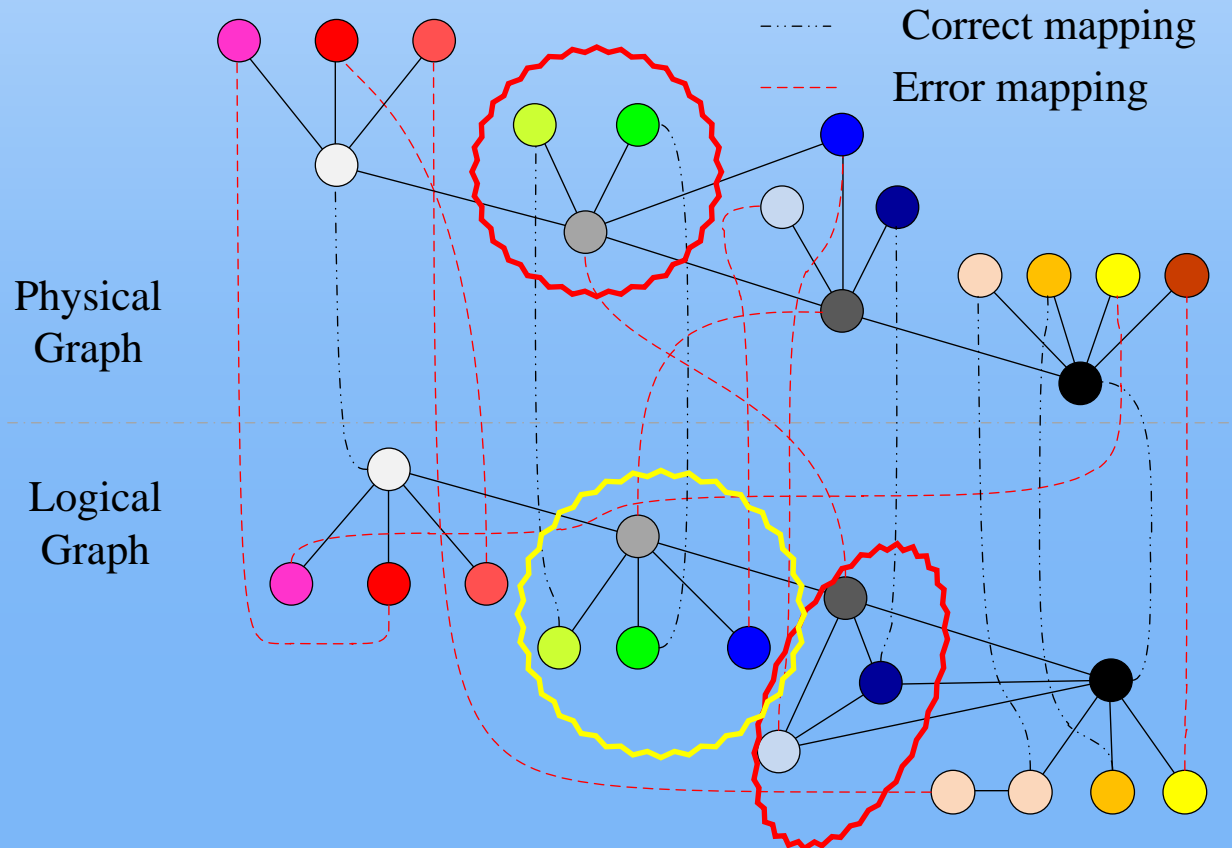
# Floor Plan Mapping

- ▣ Primary mapping result
  - ▣ Skeleton & Branch-knot mapping



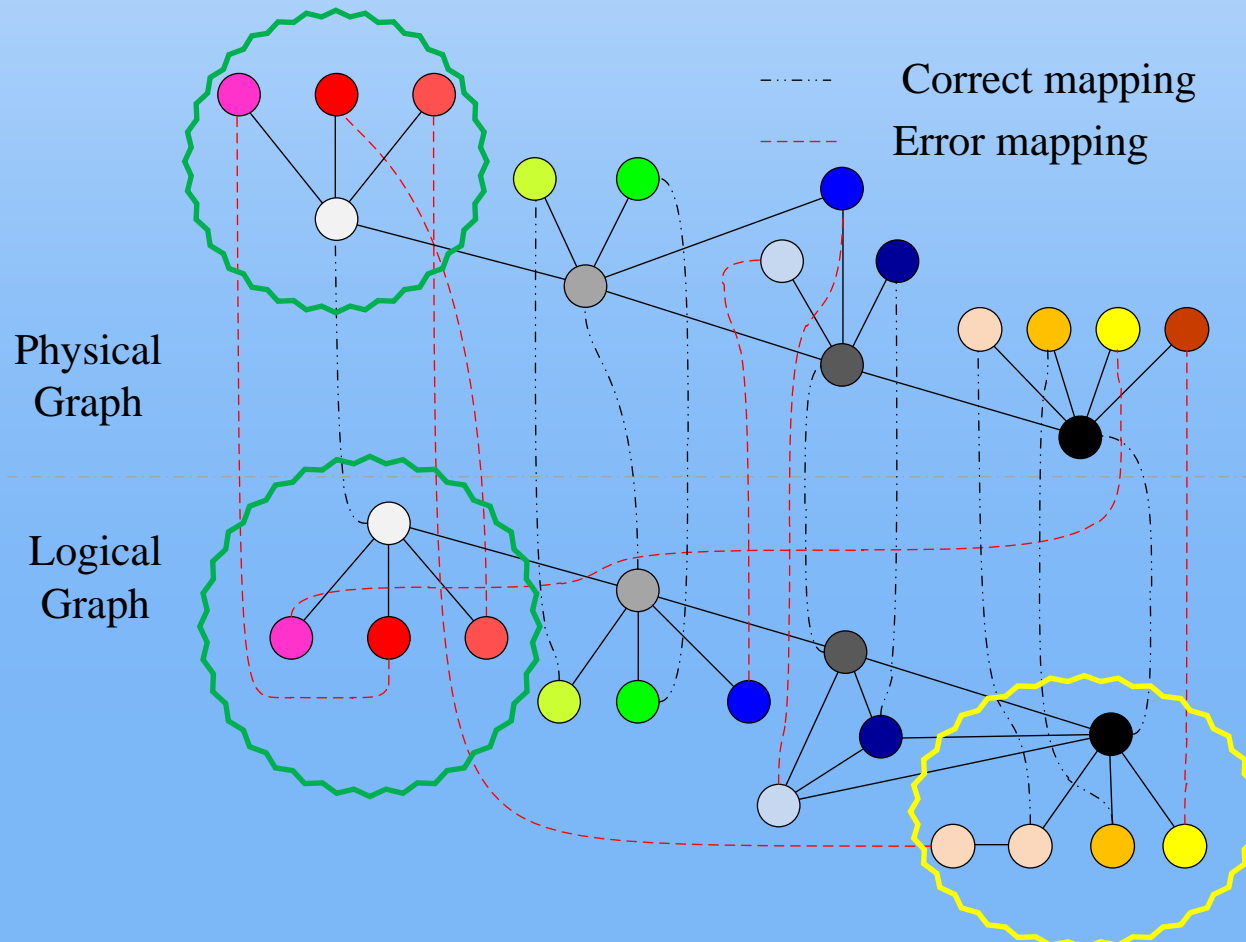
# Floor Plan Mapping

- How better?
  - Correct the primary mapping using neighbors



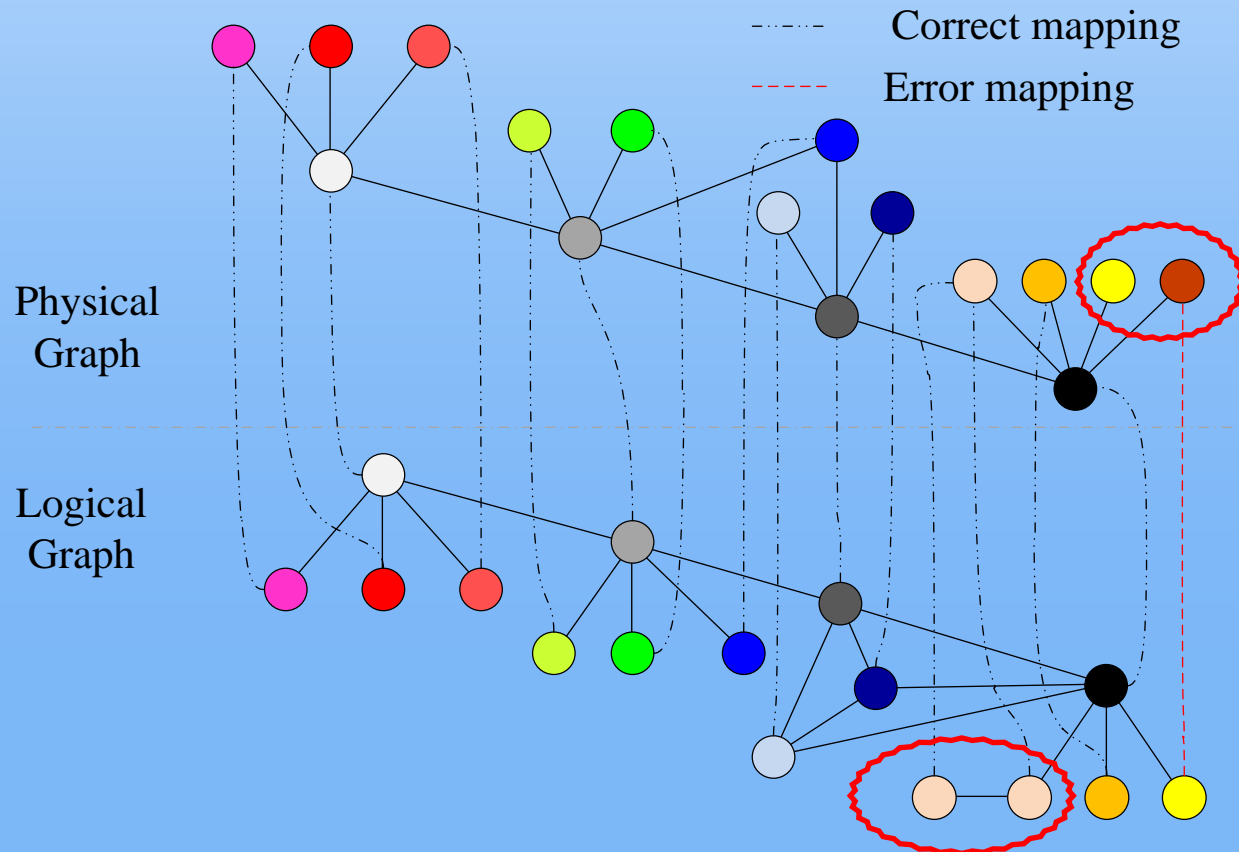
# Floor Plan Mapping

- Correct the primary mapping using neighbors



# Floor Plan Mapping

## ▣ Corrected result





# Localization

- ▣ Localize a query
  - ▣ Choose the room having maximum similarity and
  - ▣ dissimilarity  $<$  threshold value of that room
- ▣ Database Update
  - ▣ minor update: update representative fingerprints and dissimilarity thresholds
  - ▣ major update: long-term running, large data accumulated, update the RSS-location database

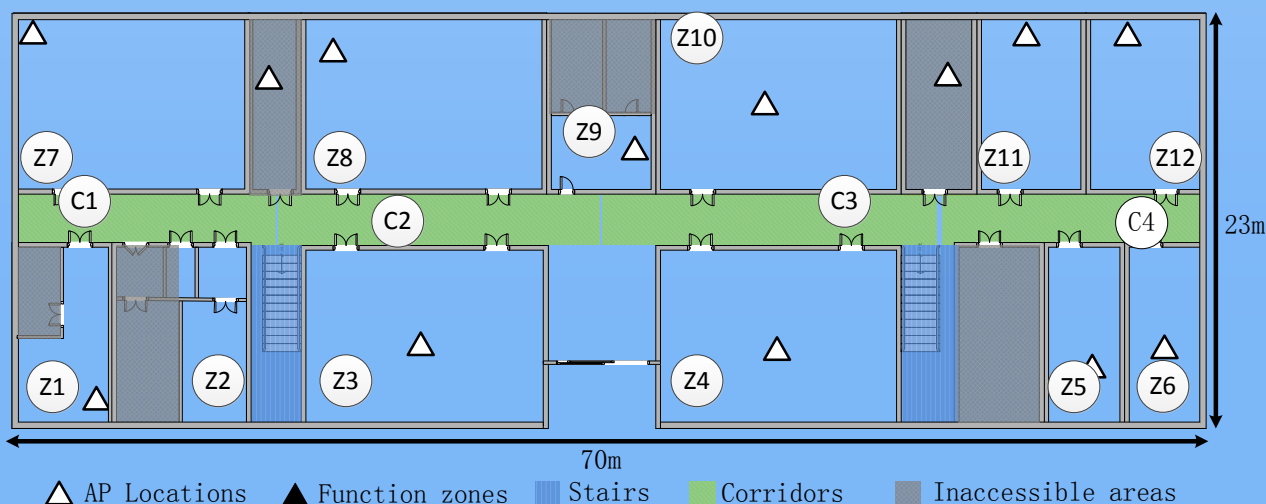
# Evaluation

A horizontal bar with four colored segments: dark blue, light blue, green, and orange.

# Evaluation

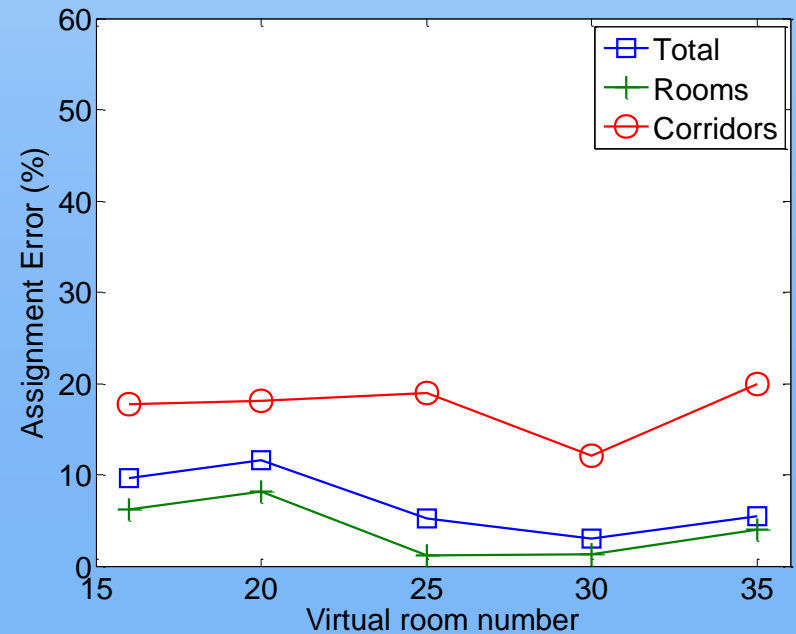
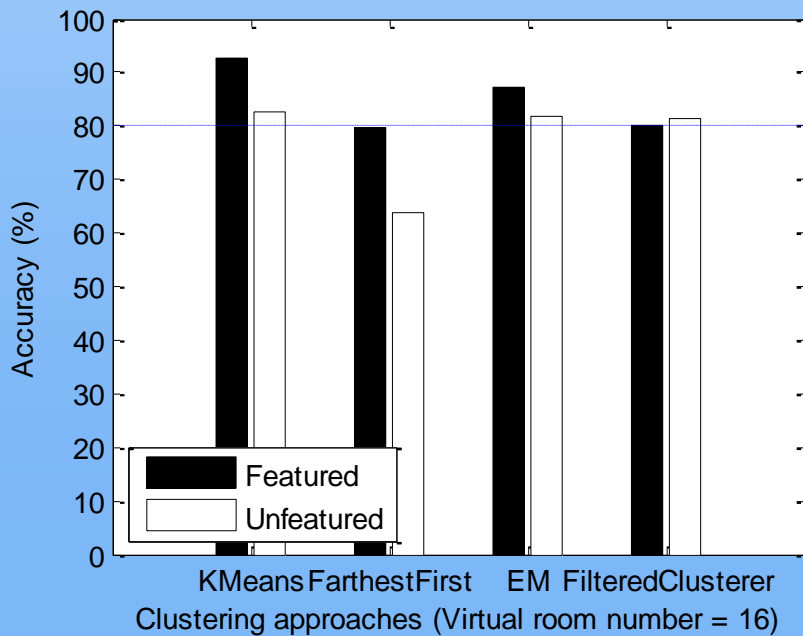
## Experiment set up

- Experimental field: An office building in Tsinghua University
- Platform: Google Nexus S phone (Android OS)
- Collect data from 4 users for a half day



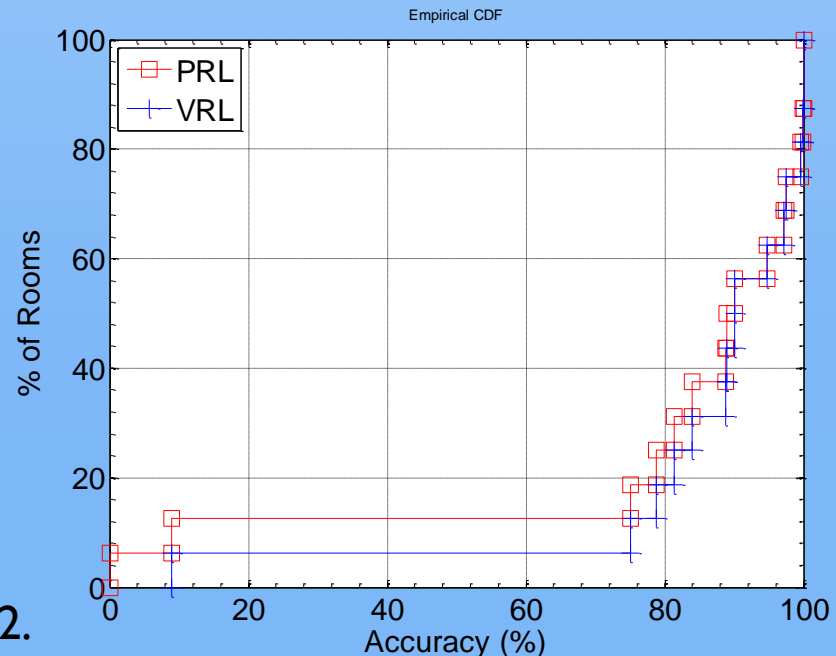
# Performance

- Clustering accuracy
  - 93% using k-means when  $k=16$
  - RSS stacking difference is better



# Performance

- Mapping result
  - 15 out of 16 virtual rooms are correct
  - 14 out of 16 physical rooms are correct
- Localization accuracy
  - Average accuracy: 86%
  - Similar to SurroundSense
  - But **without site survey!**



M. Azizyan, et al "Surroundsense: mobile phone localization via ambience fingerprinting," in Proceedings of the ACM MobiCom, 2009, pp. 261–272.

# Limitations & Discussion

A horizontal decorative bar consisting of a dark blue base with four colored segments: light blue, green, and orange.

# Limitations

- ▣ Practical Data Collection
  - ▣ Differentiate data from indoor & outdoor
- ▣ Symmetry of floor plan graph (building)
  - ▣ Mapping limitations
  - ▣ Global reference points
  - ▣ Leverage more sensors: compass, gyroscope, etc.
- ▣ Building types:
  - ▣ Work for most office buildings, but may fail in large open environments, such as hall, atrium, gymnasium, or museum.

# Future Work

- Physical floor plan construction
  - Remove the dependence on physical floor plan
  - Auto-generate the floor plan
- Sophisticated floor plan mapping
  - Advanced algorithms to achieve better accuracy
  - Move the framework to physical localization
- User behavior detection
  - Semantically meaningful localization



# Conclusions

- WILL: a wireless indoor logical localization approach
- No site survey or knowledge of AP locations and power settings.
- WILL demonstrates its advantage on low human cost, a long-standing and universal will in wireless indoor localization.

Thank you!

Q&A