

MAS.S60

# How to Wirelessly Sense Almost Anything

## Lecture 3: Fundamentals of Wireless Sensing

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# This Week in Wireless Sensing

GIZMODO



GADGETS

## WiZ's Smart Lights Can Detect Presence Now—No Motion Sensors Required

It makes automatic lighting accessible without having to set up a router.

By Florence Ion

9/16/22 4:00PM | Comments (7) | Alerts

## Your Raptor Lake PC can sleep when you leave

By Jacob Ridley published 13 days ago

Using only standard Wi-Fi technology.



Listen to this article

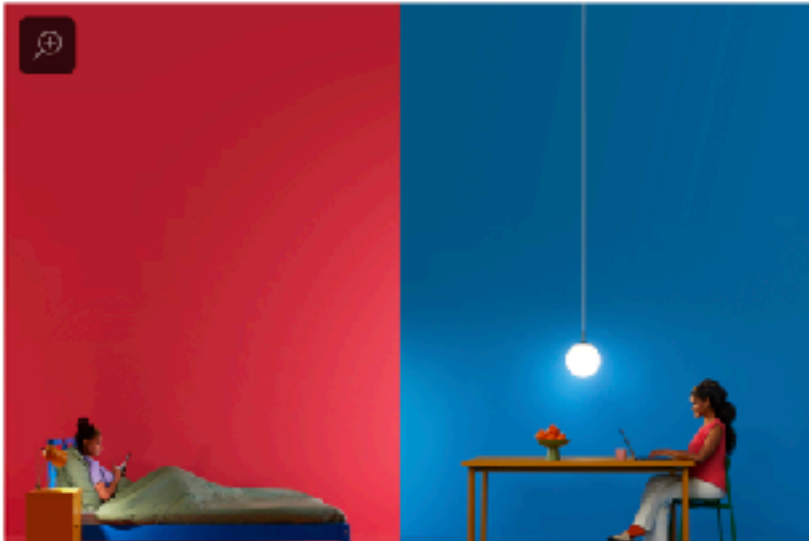


## This at-home radio sensor could help monitor symptoms of patients with Parkinson's

The router-like device can track treatments for the neurological disease, too.

BY THE PEOPLE (PHOTO: SHUTTERSTOCK, GETTY IMAGES)

HEALTH



# Objectives of Today's Lecture

Learn the fundamentals, applications, and implications of **contactless wireless sensing**

1. What is wireless (aka WiFi) sensing?
2. How do seeing through wall systems work?
3. How can we monitor human vital signs using wireless signals?
4. What are the industry opportunities and societal implications of wireless sensing (today and in the near+far future)?

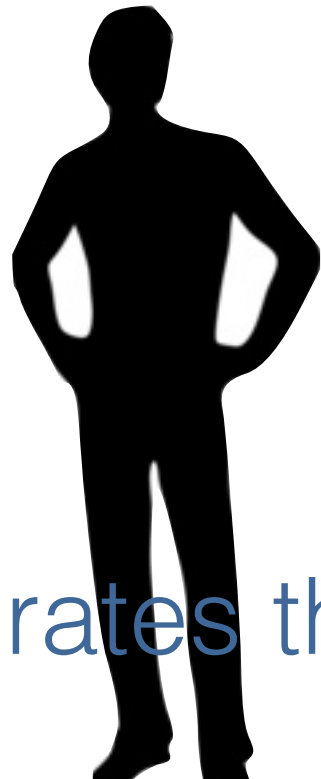
# Last Week

## Device-based Localization



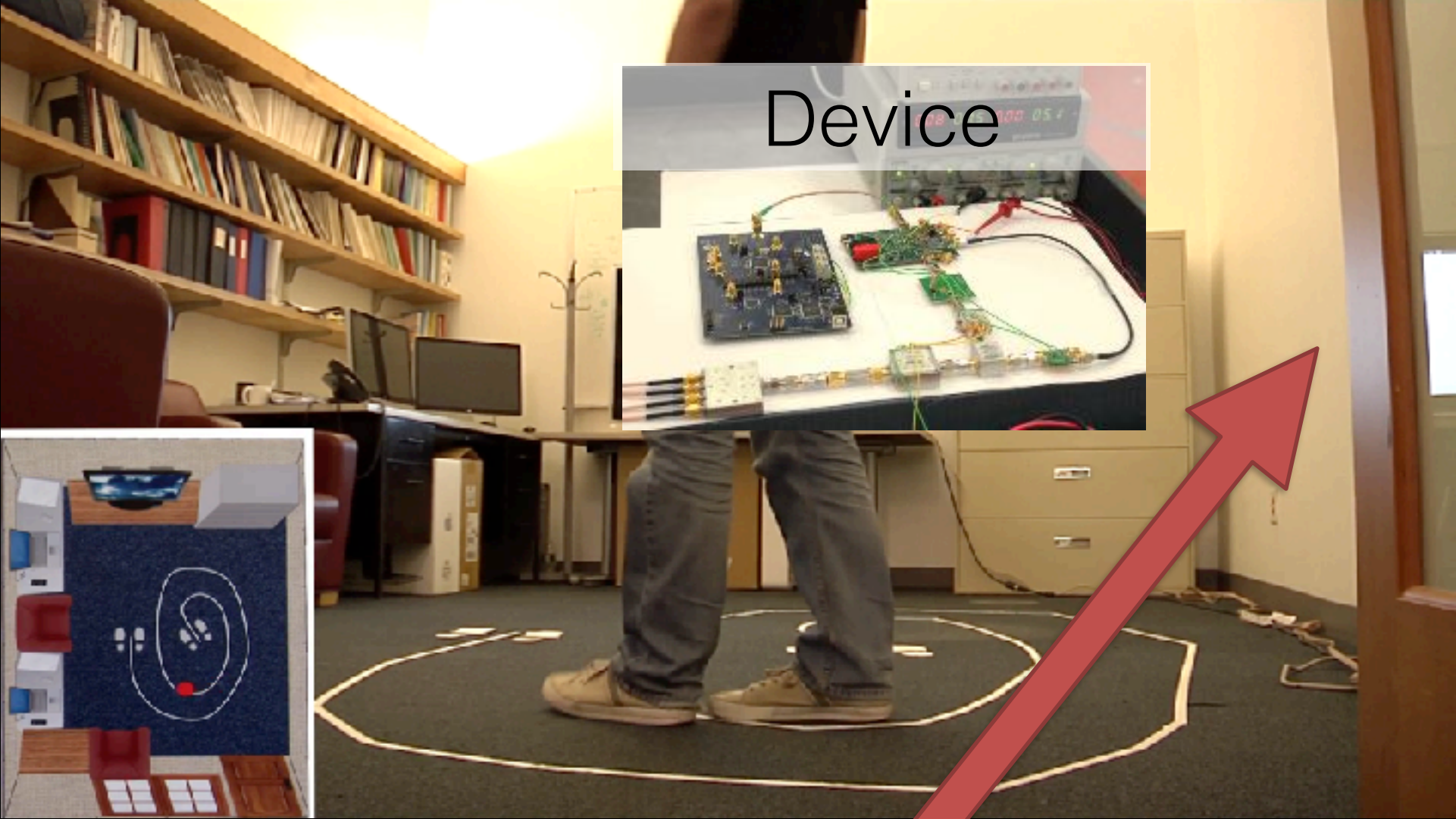
Today: Device-Free Localization  
(aka **Wireless Sensing**)

Using radio signals to track humans  
without any sensors on their bodies



Operates through occlusions

Example: WiTrack



Device

Device in another room



# Applications

## Smart Homes



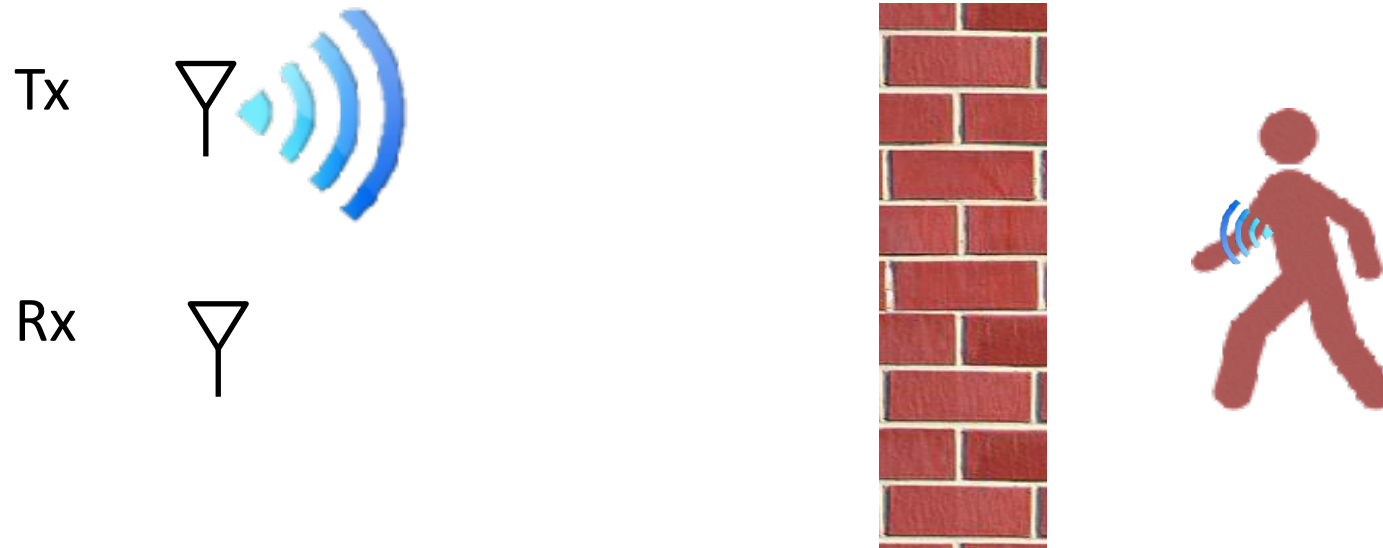
## Energy Saving



## Gaming & Virtual Reality



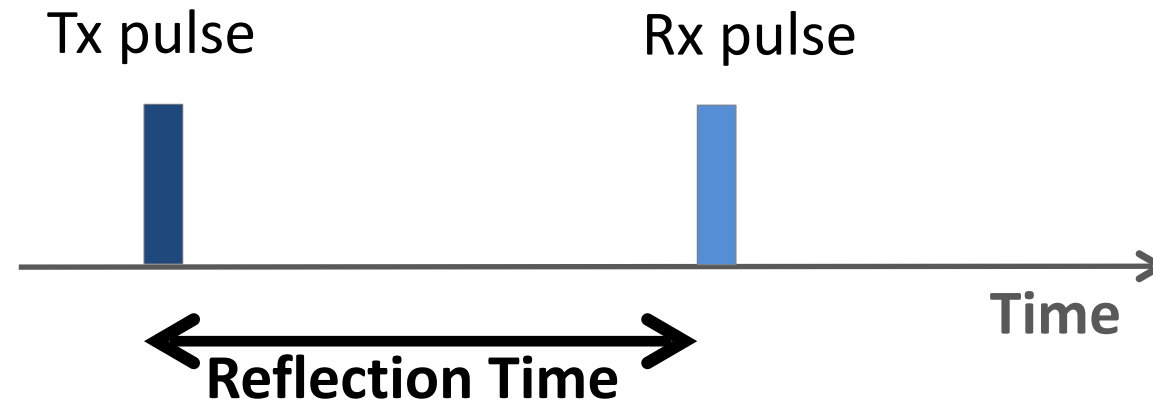
# Measuring Distances



Distance = Reflection time x speed of light

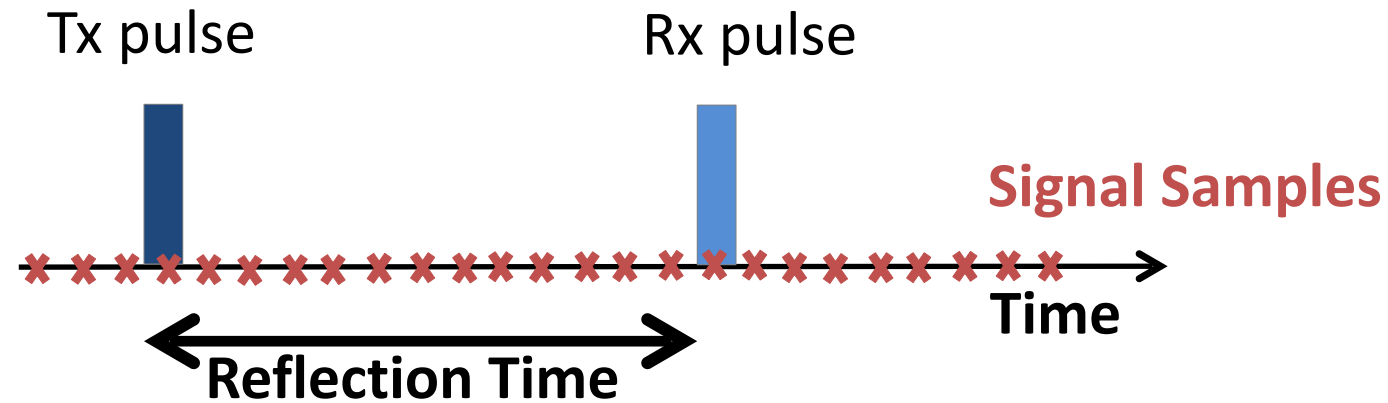
# Measuring Reflection Time

Option1: Transmit short pulse and listen for echo



# Measuring Reflection Time

Option 1: Transmit short pulse and listen for echo



**Capturing the pulse needs sub-nanosecond sampling**

**Why?**

What if instead of RF we use ultrasound?

# Capturing the pulse needs sub- nanosecond sampling

Why?

Multi-GHz samplers are expensive, have high noise, and create large I/O problem

Why if instead of RF we use ultrasound?

Distance = time x speed

“smallest  
distance  
resolution”

“smallest  
time”

$$10cm = \Delta t \times (3 \times 10^8)$$

$$\Delta t = 0.3ns$$

0.3ns period => how many samples per second?

$$SamplingRate = \frac{1}{\Delta t}$$

3GSps! >> MSps for WiFi, LTE...

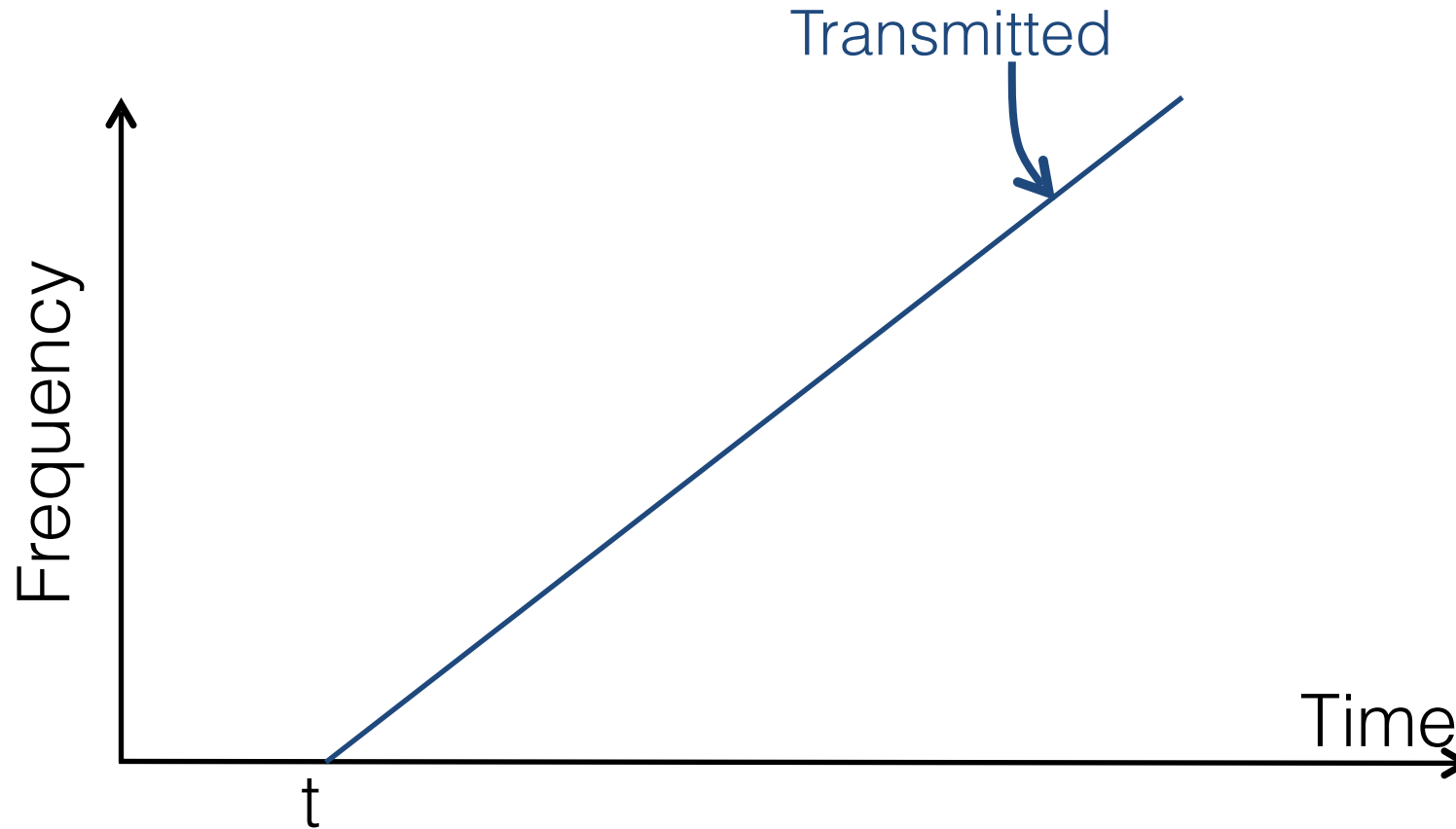
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because speed of ultrasound

$$10cm = \Delta t \times 345$$

$$SamplingRate = \frac{1}{\Delta t} \approx 3kbps$$

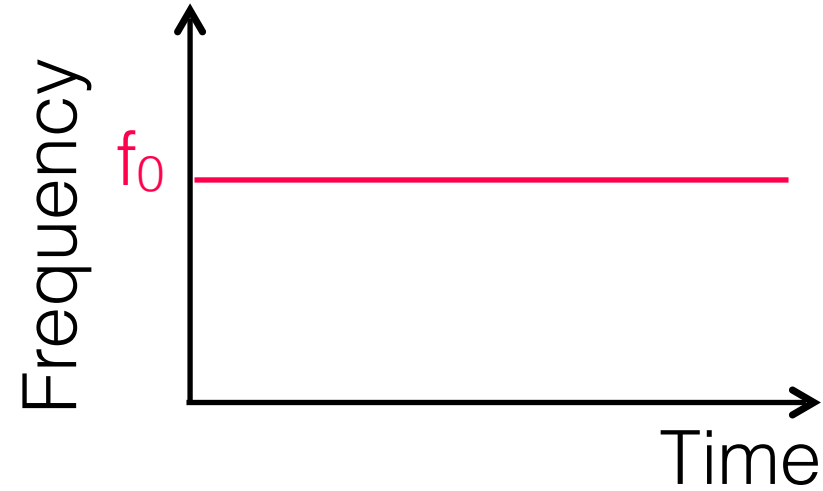
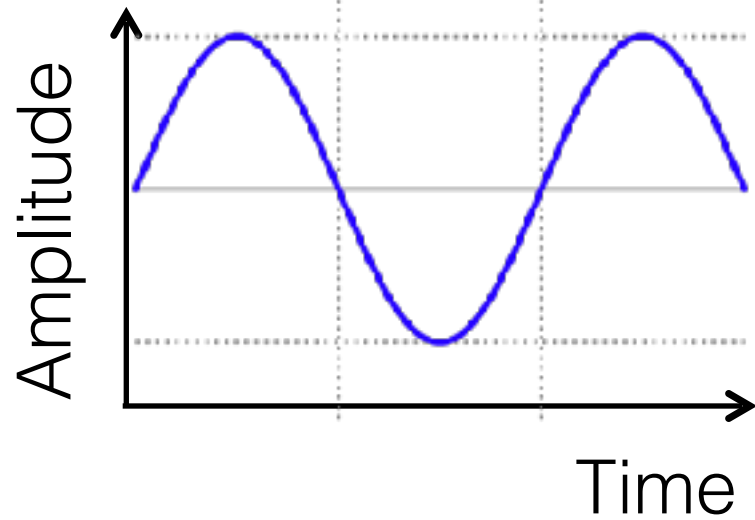
# FMCW: Measure time by measuring frequency



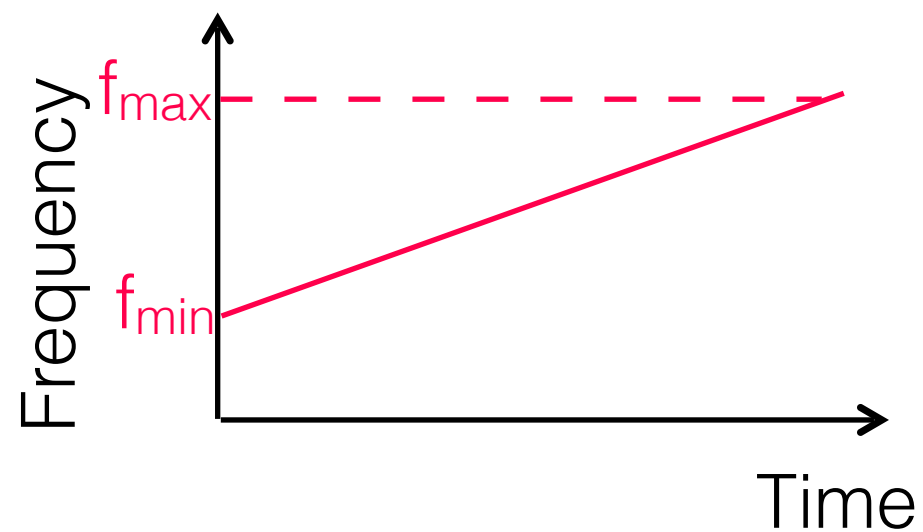
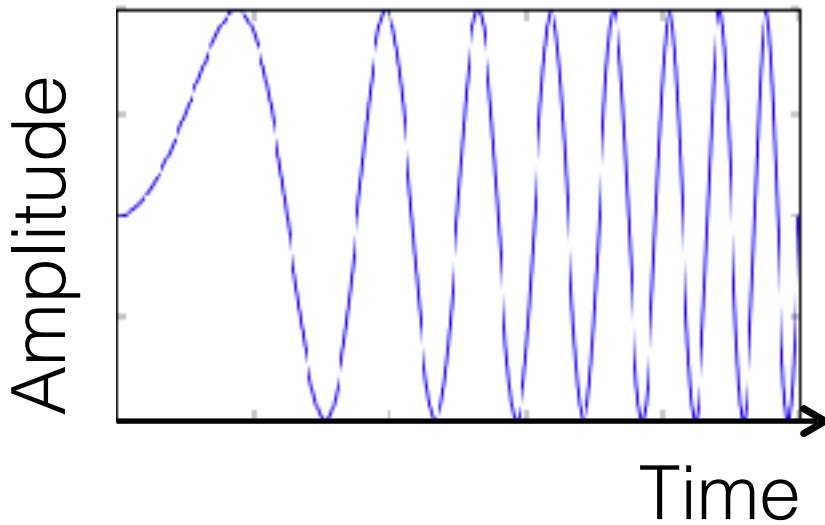
**How does it look in time domain?  
(and in comparison to single frequency)**

# More intuitive understanding of FMCW

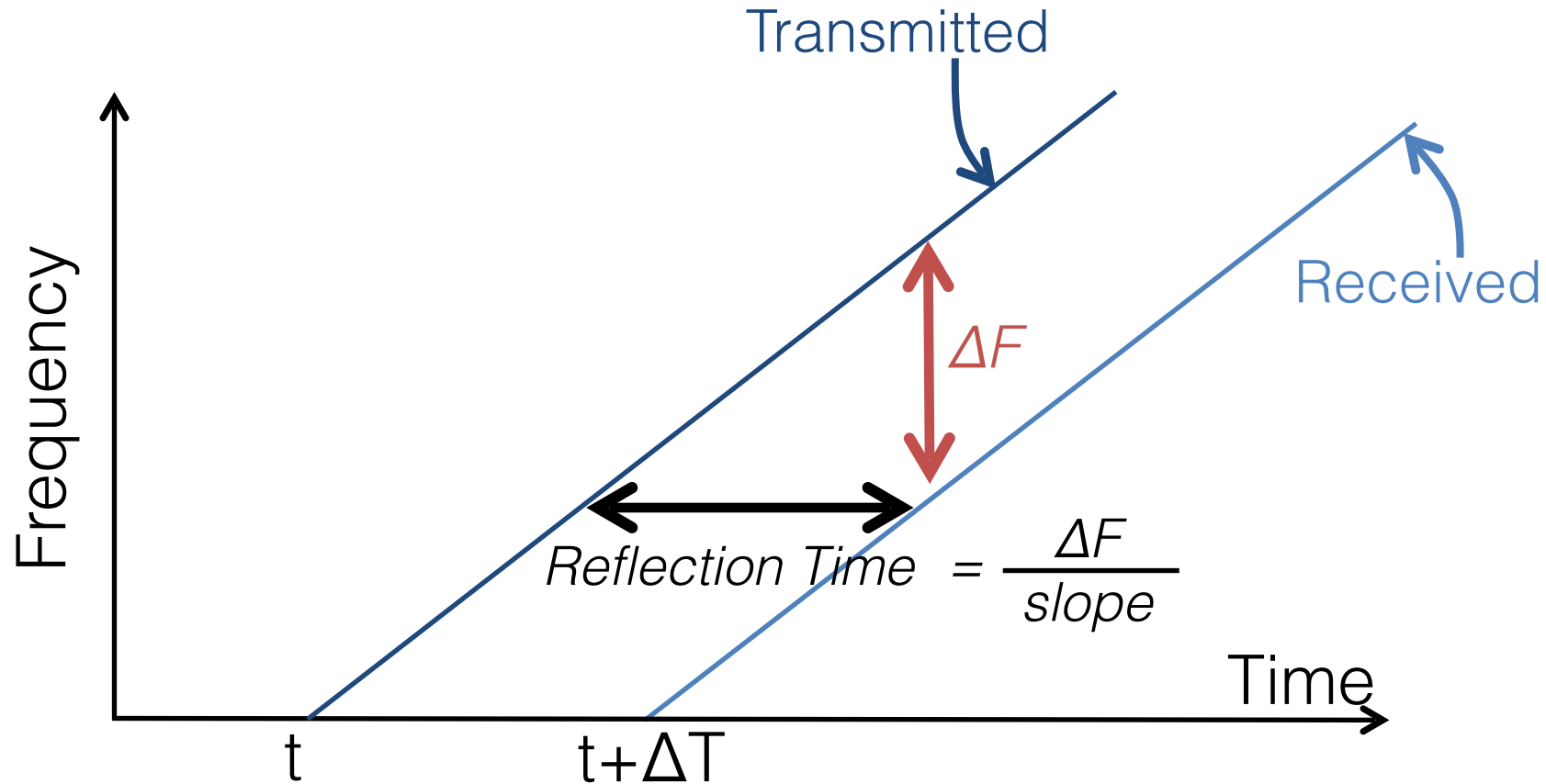
Wireless Signal at frequency  $f_0$



FMCW signal



# FMCW: Measure time by measuring frequency

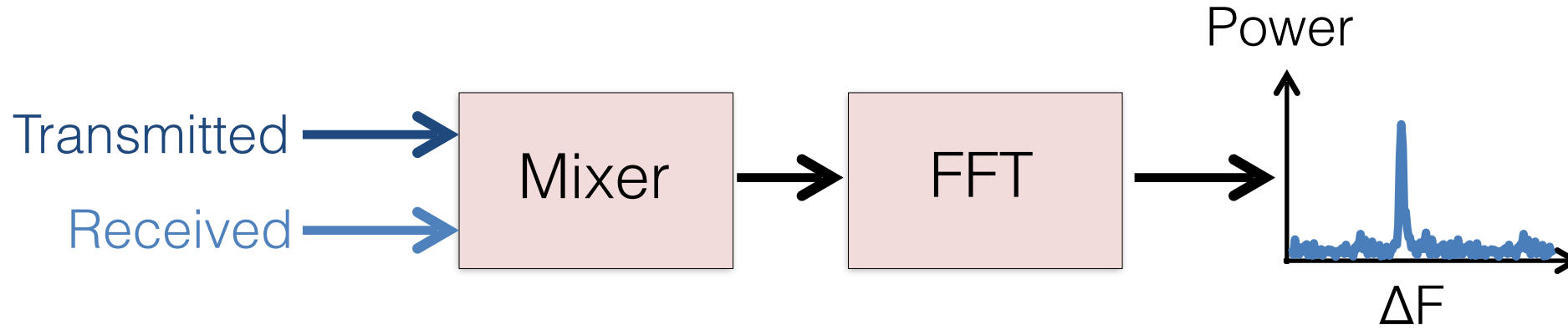


How do we measure  $\Delta F$ ?



# Measuring $\Delta F$

- Subtracting frequencies is easy (e.g., removing carrier in WiFi)
- Done using a mixer (low-power; cheap)

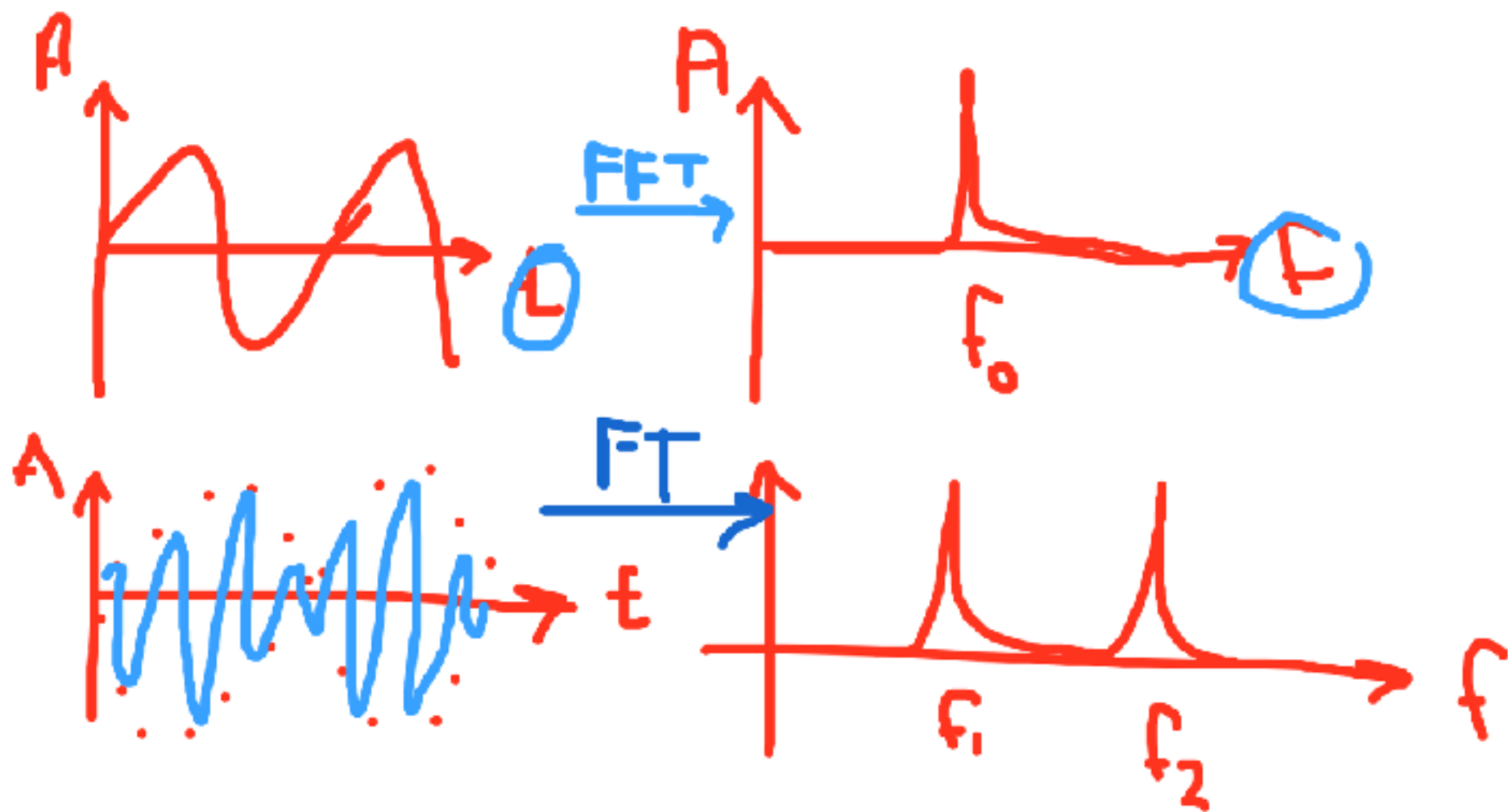


Signal whose frequency is  $\Delta F$

let's talk about FFTs a bit — freq

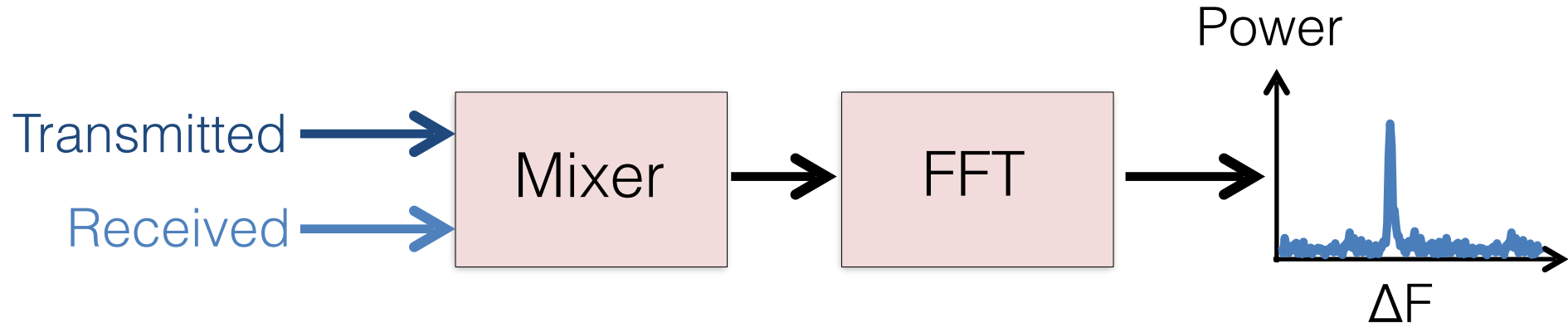
# Basics of Fourier Transform

# Basics of Fourier Transform



# Measuring $\Delta F$

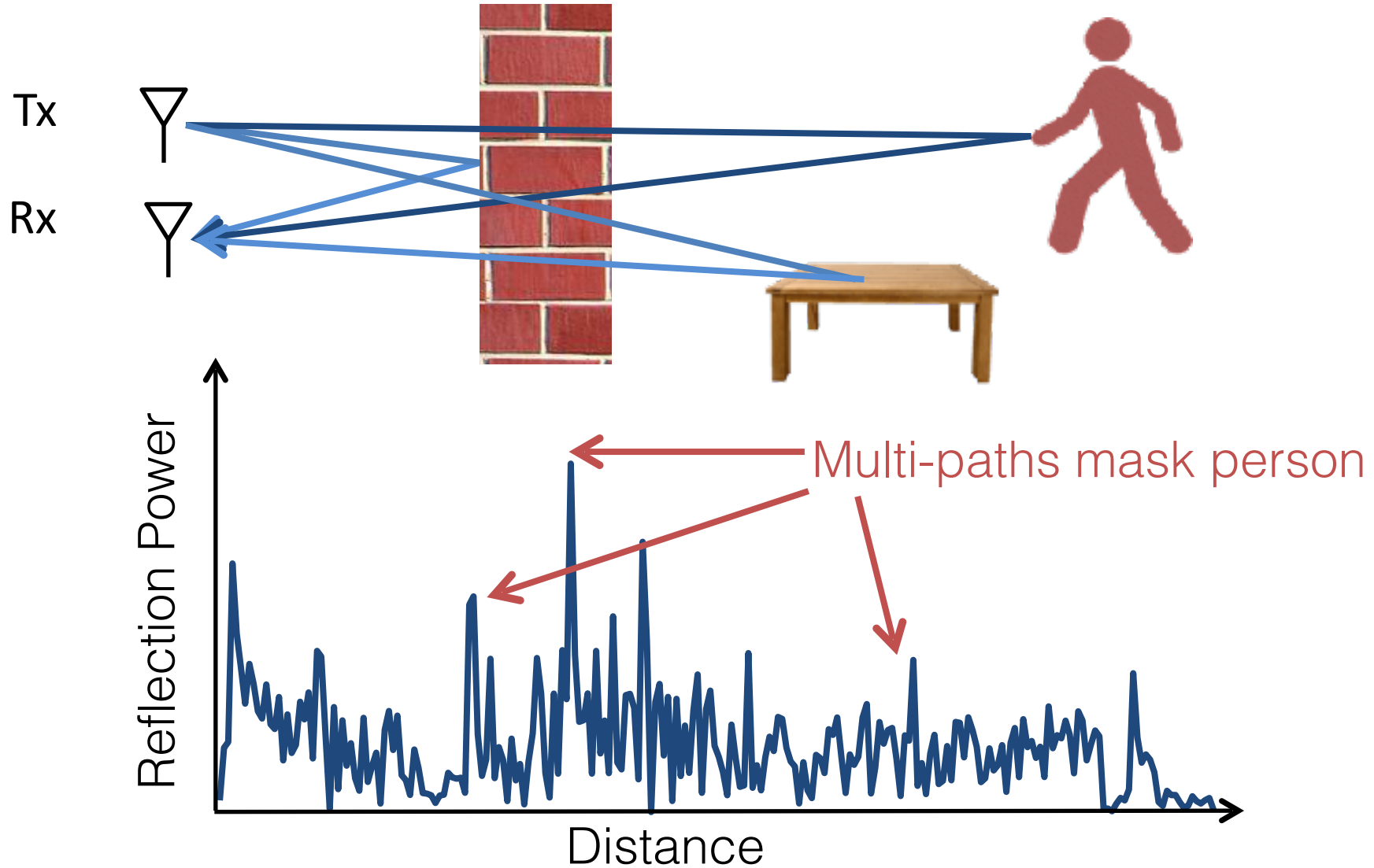
- Subtracting frequencies is easy (e.g., removing carrier in WiFi)
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Signal whose frequency is  $\Delta F$

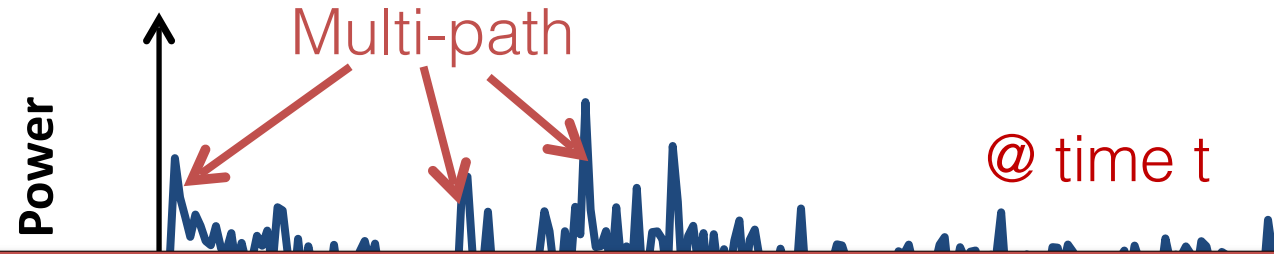
$\Delta F \rightarrow$  Reflection Time  $\rightarrow$  Distance

# Challenge: Multipath → Many Reflections

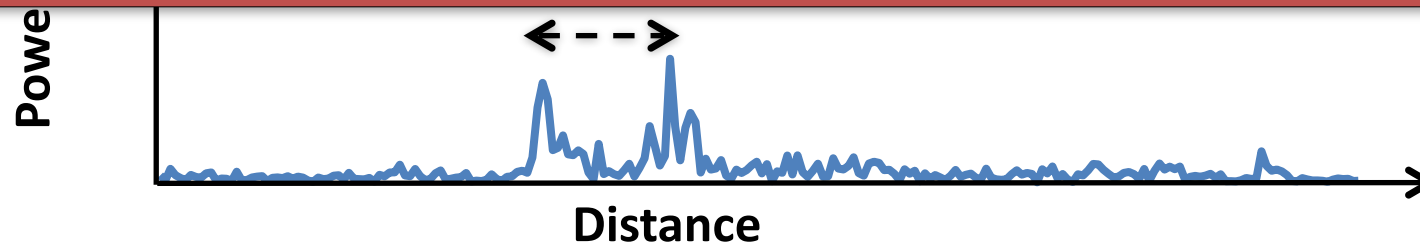


Static objects don't move

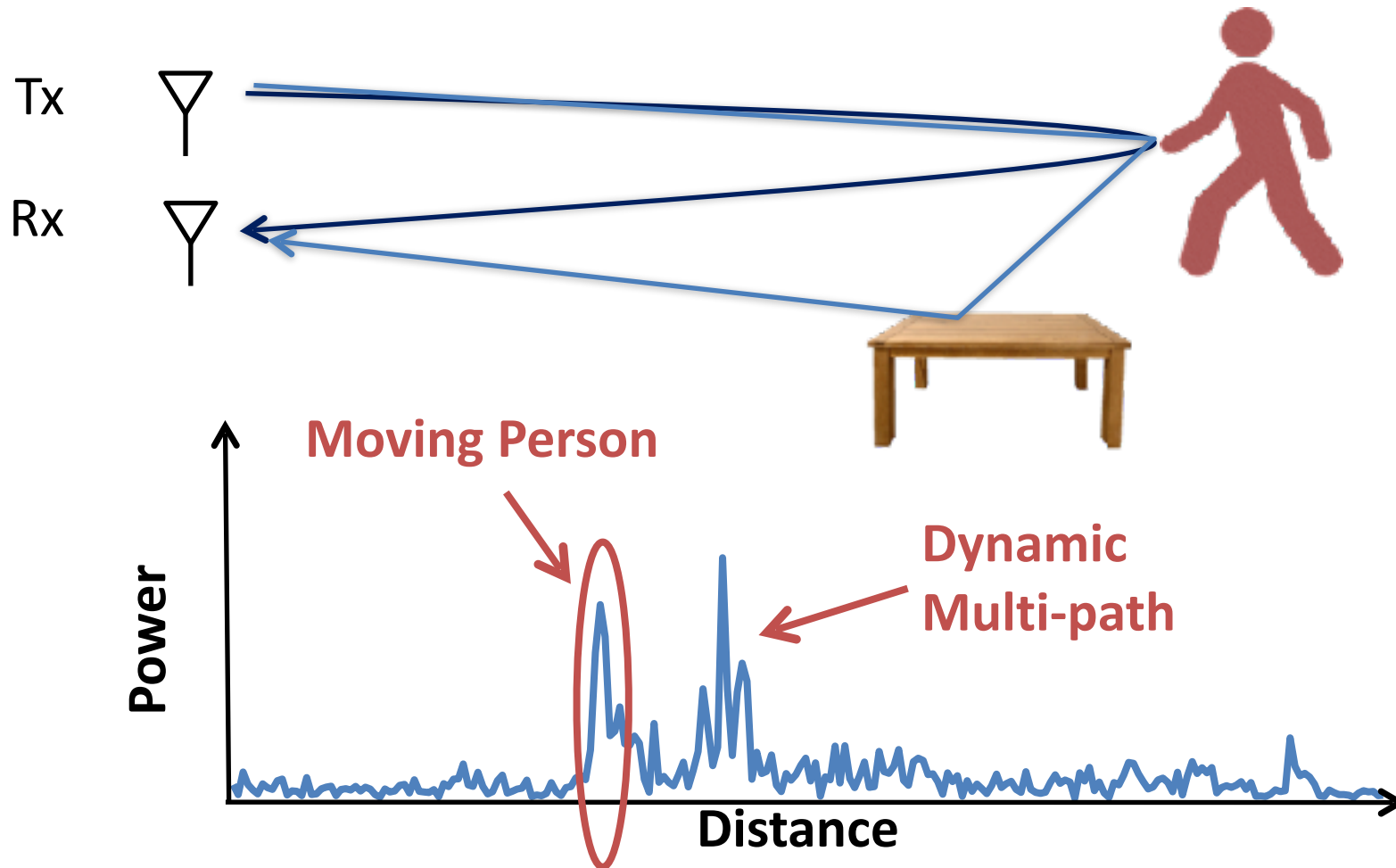
→ Eliminate by subtracting consecutive measurements



Why 2 peaks when we only have one moving person?

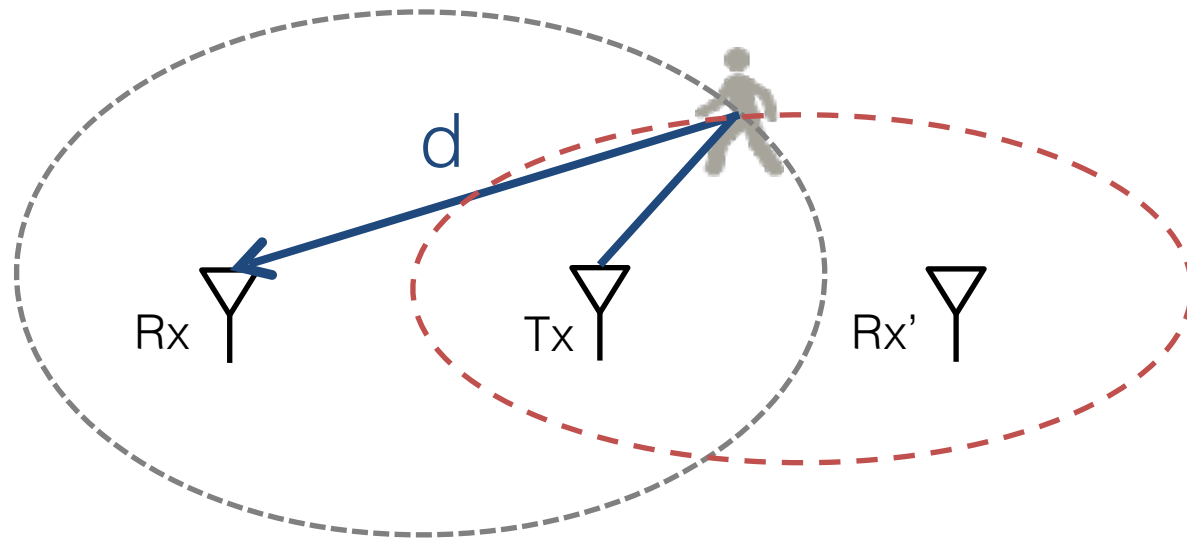


The direct reflection arrives before dynamic multipath!



# Mapping Distance to Location

Person can be anywhere on an ellipse whose foci are (Tx,Rx)



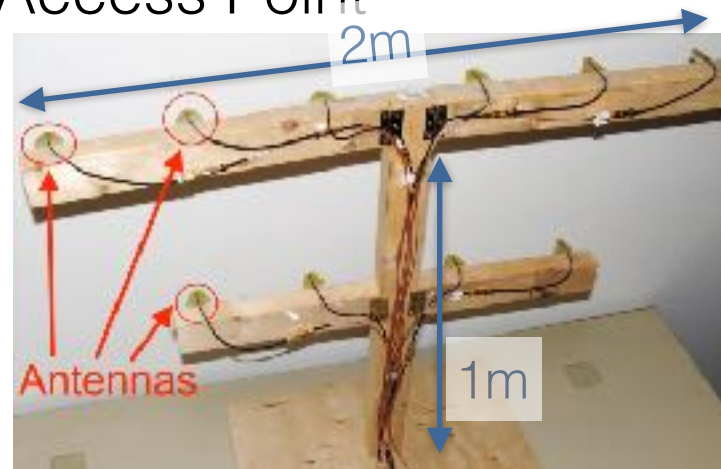
By adding another antenna and intersecting the ellipses, we can localize the person



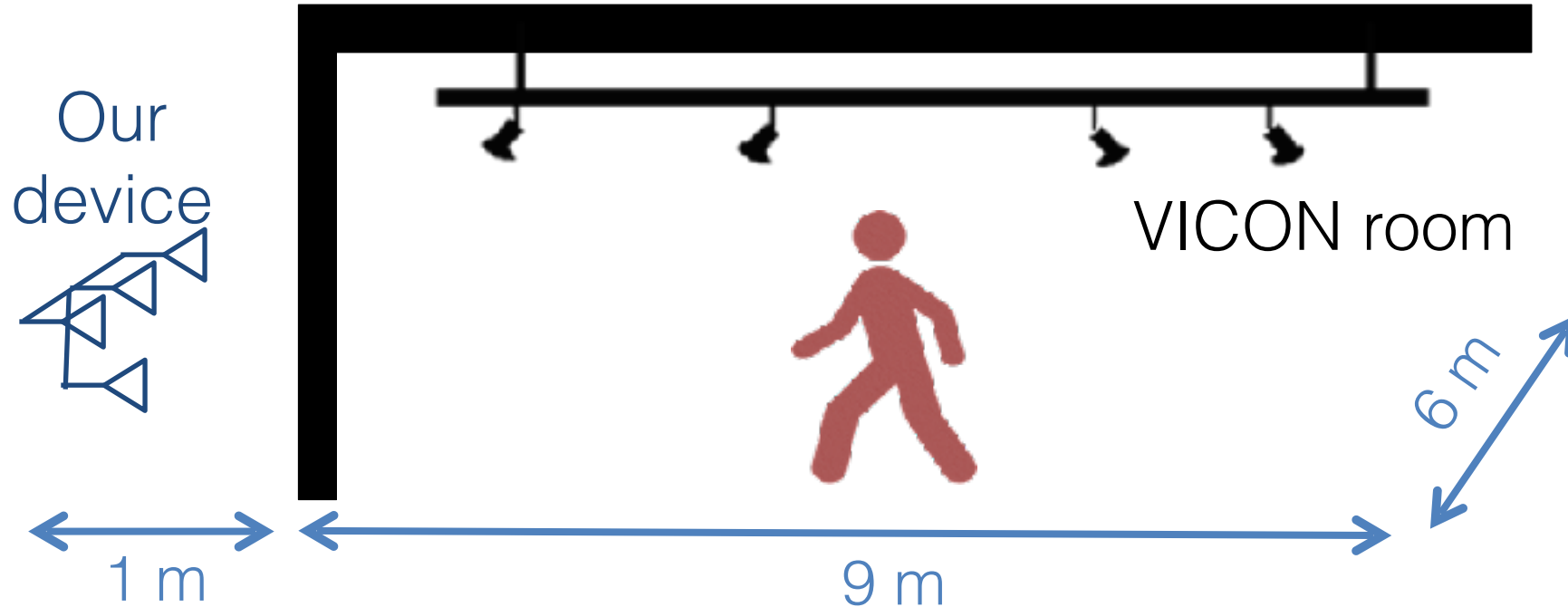
From Location to tracking (over time)

# Implementation

- Built FMCW front-end
  - Connected to USRP
- Band: 5.5-7.2 GHz
- Transmit  $70 \mu\text{W}$ 
  - 1000x lower power than WiFi Access Point
- 5 Tx, 5 Rx antennas



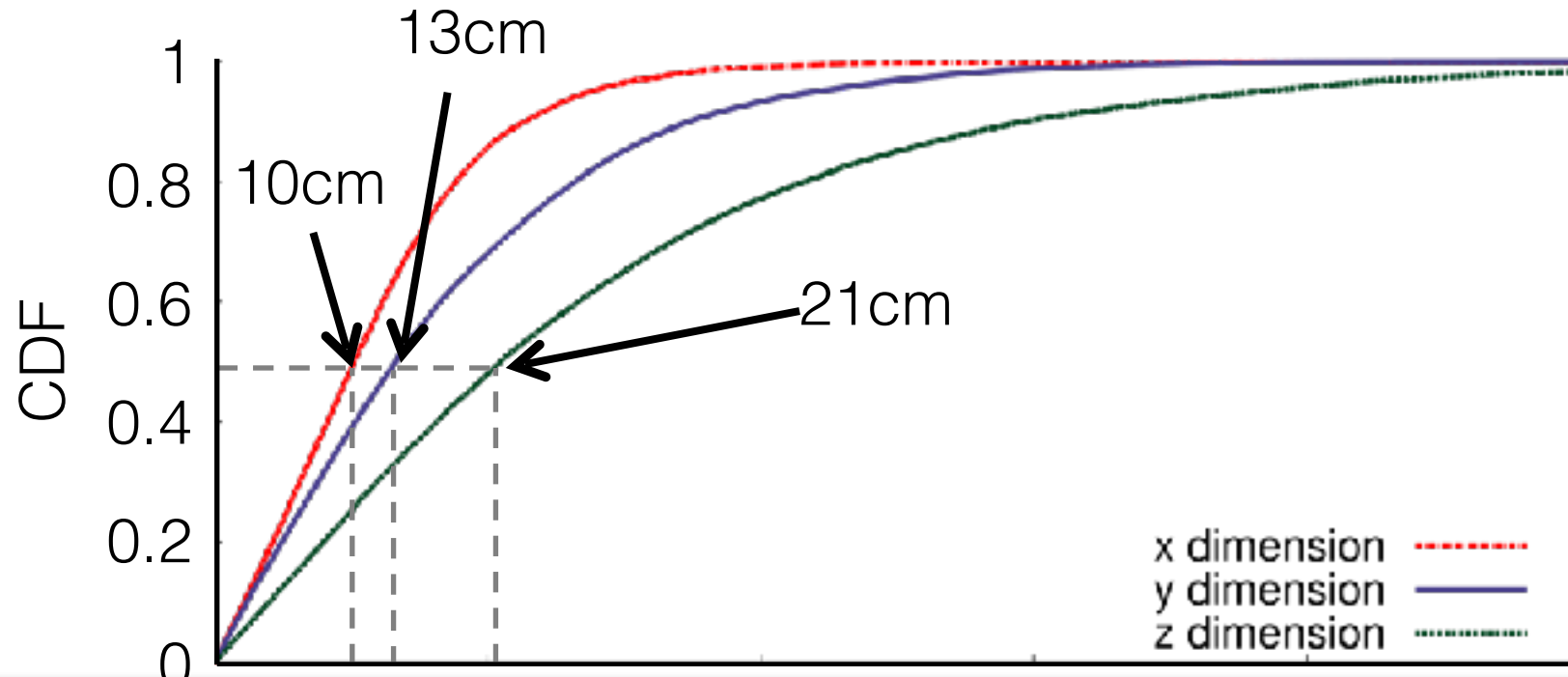
# Ground Truth via VICON



- VICON uses an array of infrared cameras on the ceiling and operates in line-of sight
  - It achieves sub-cm-scale accuracy
- Our device is placed outside the room

# Through-Wall Localization Accuracy

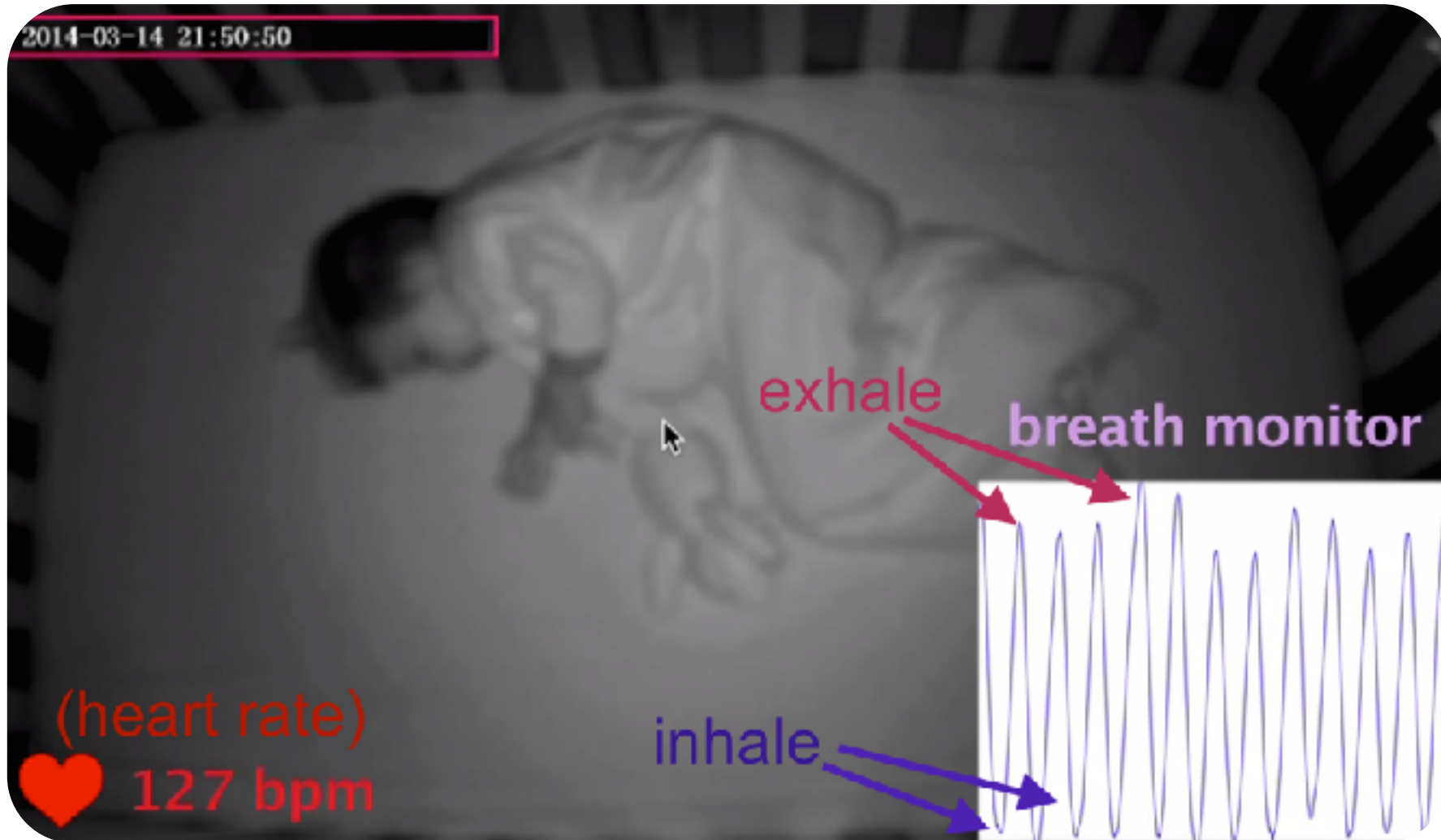
100 experiments:  $\frac{1}{2}$  million location measurements



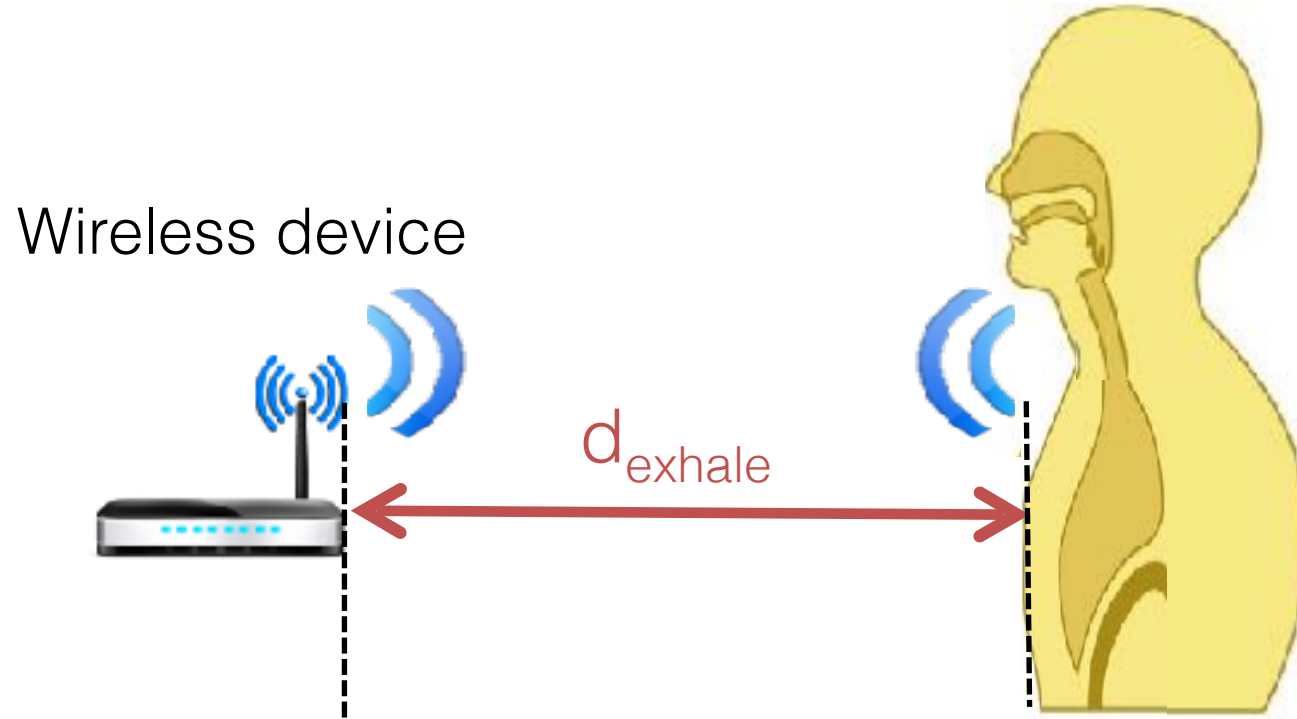
Centimeter-scale localization without requiring the user to carry a wireless device

# Remotely Measuring Breathing and HR

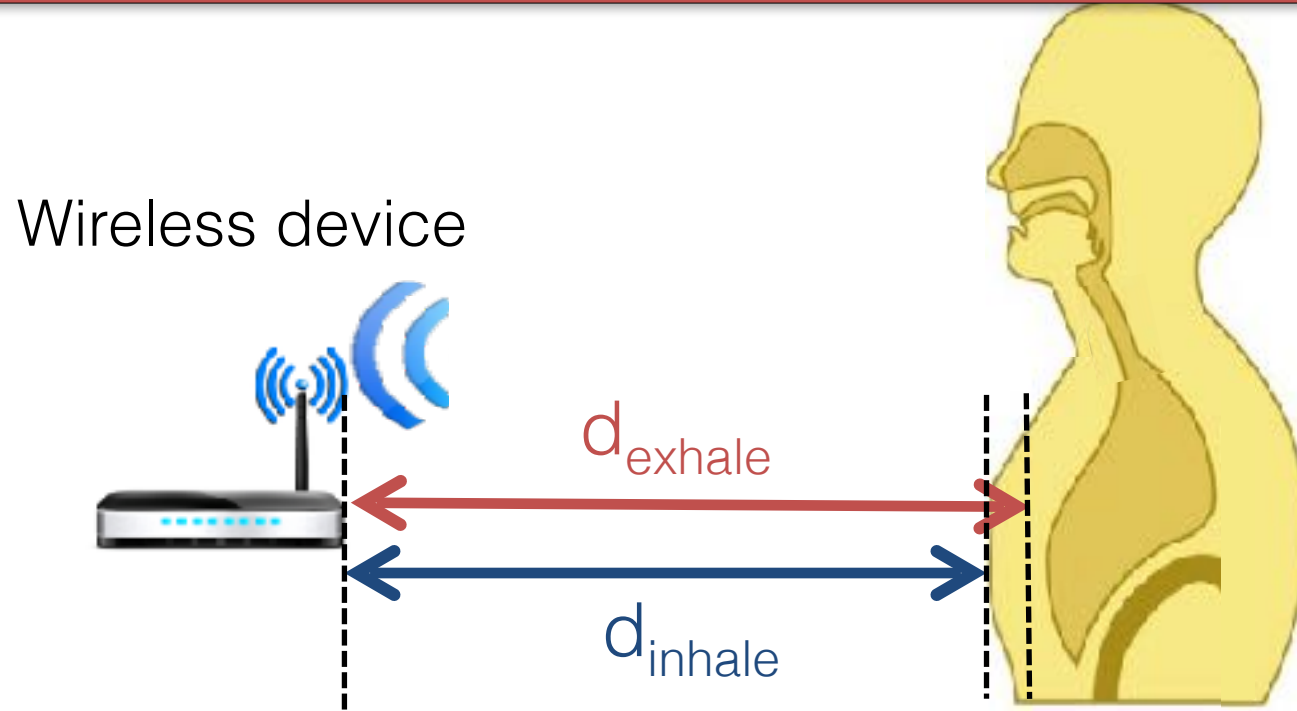
[CHI'15]



Idea: Use wireless reflections off the human body

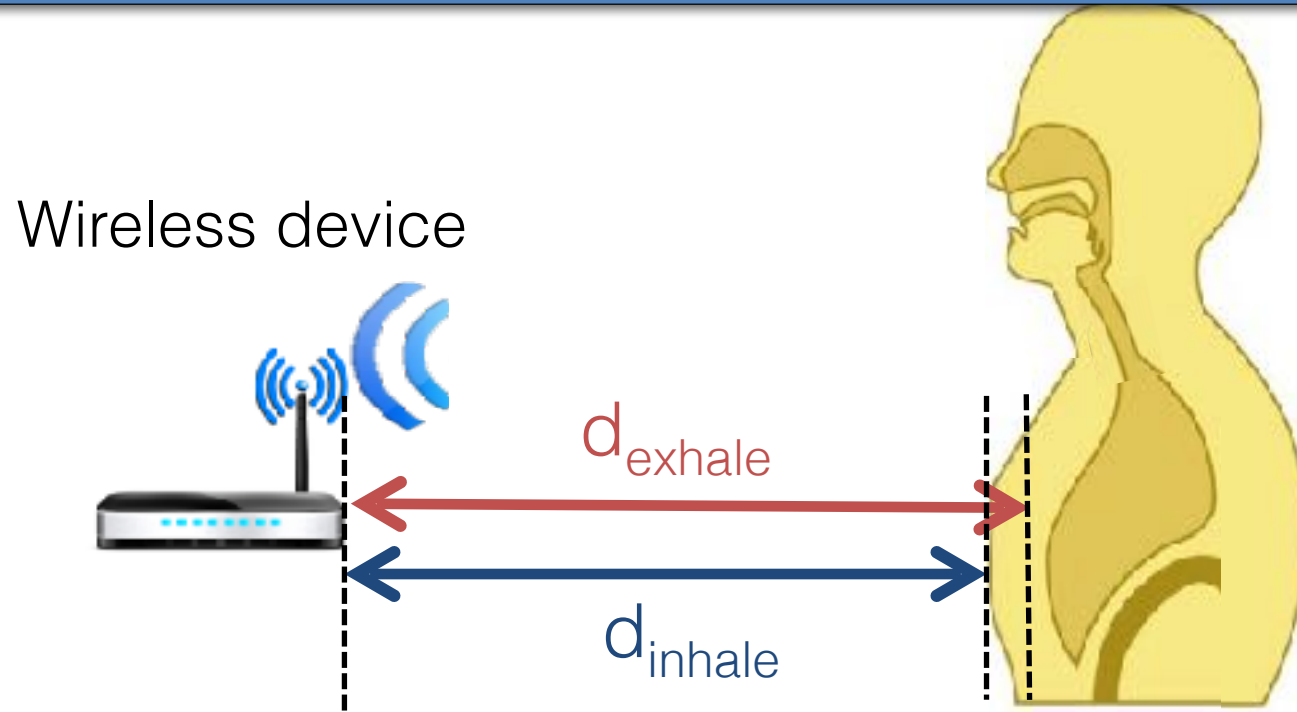


Problem: Localization accuracy is only 12cm and cannot capture vital signs



Why? How did we compute the resolution?

# Solution: Use the phase of the wireless reflection



Why does phase allow us to get the distance at higher granularity?



Solution: Use the phase of the wireless reflection

Wireless device



Why did we need FMCW if phase is so accurate?

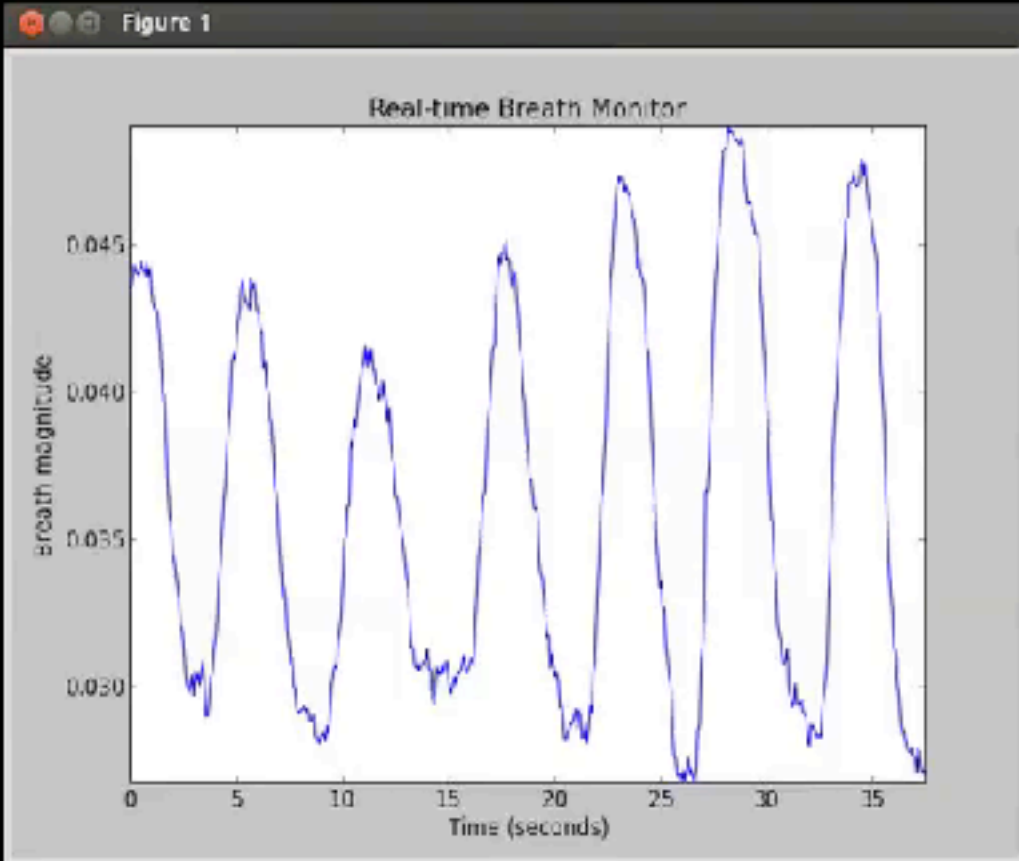
$d_{inhale}$



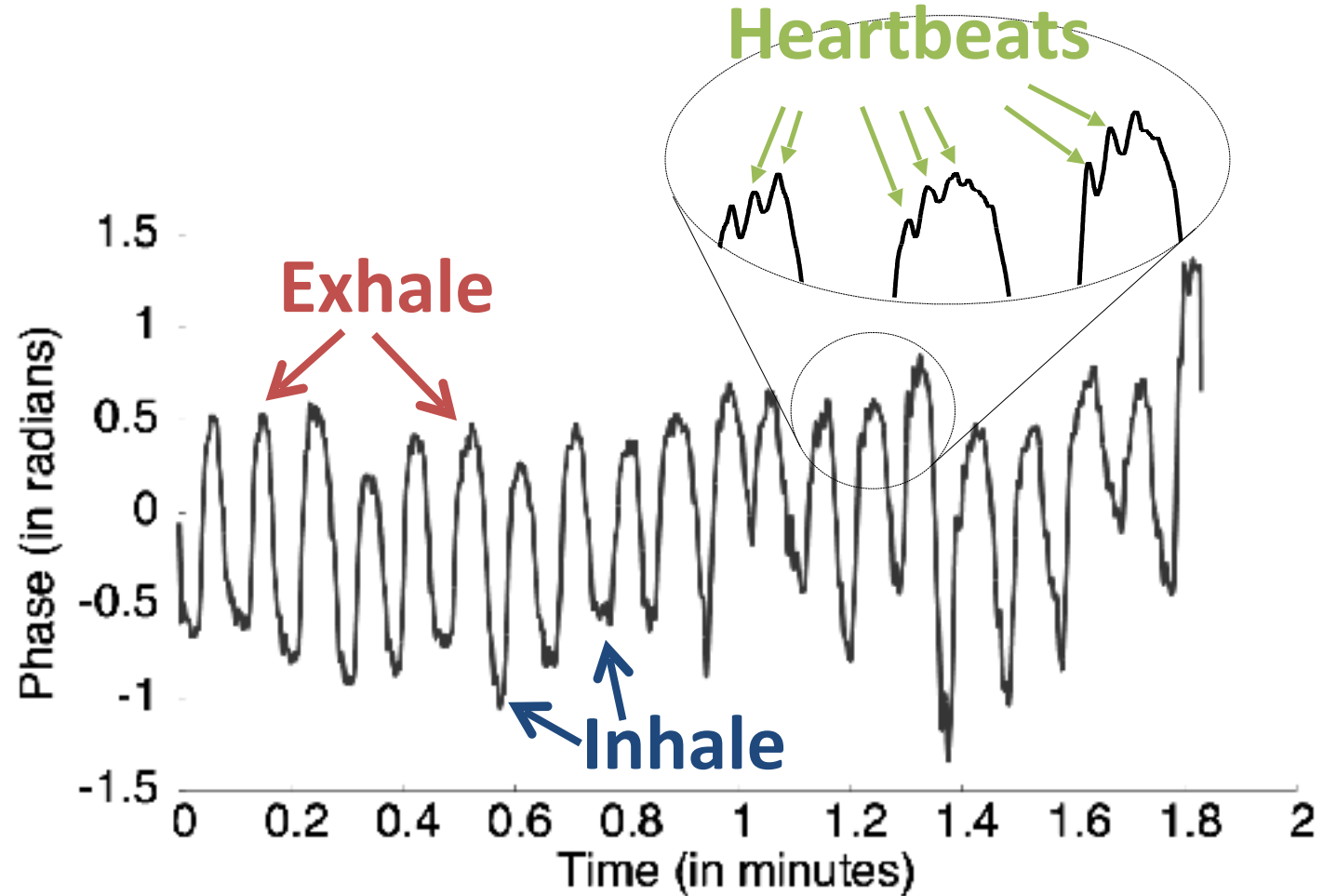
Wireless wave has a phase:  $\phi = 2\pi \frac{\text{distance}}{\text{wavelength}}$

- Chest Motion changes distance
- Heartbeats also change distance

# Breath Monitoring using Wireless (Vital-Radio, 2015)



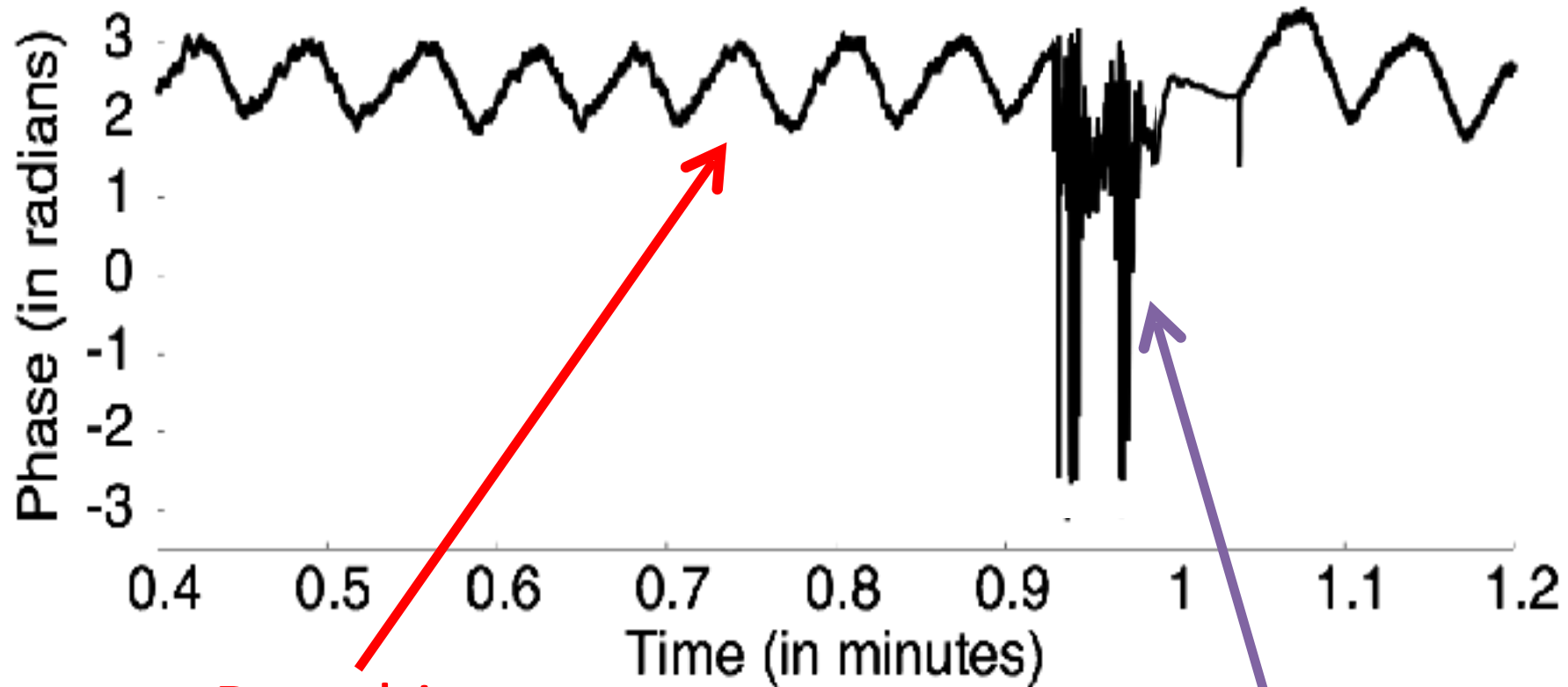
Let's zoom in on these signals



How do we get from here to extracting breathing rate and heart rate?

What happens when a person moves  
his limb?

# What happens when a person moves his limb?

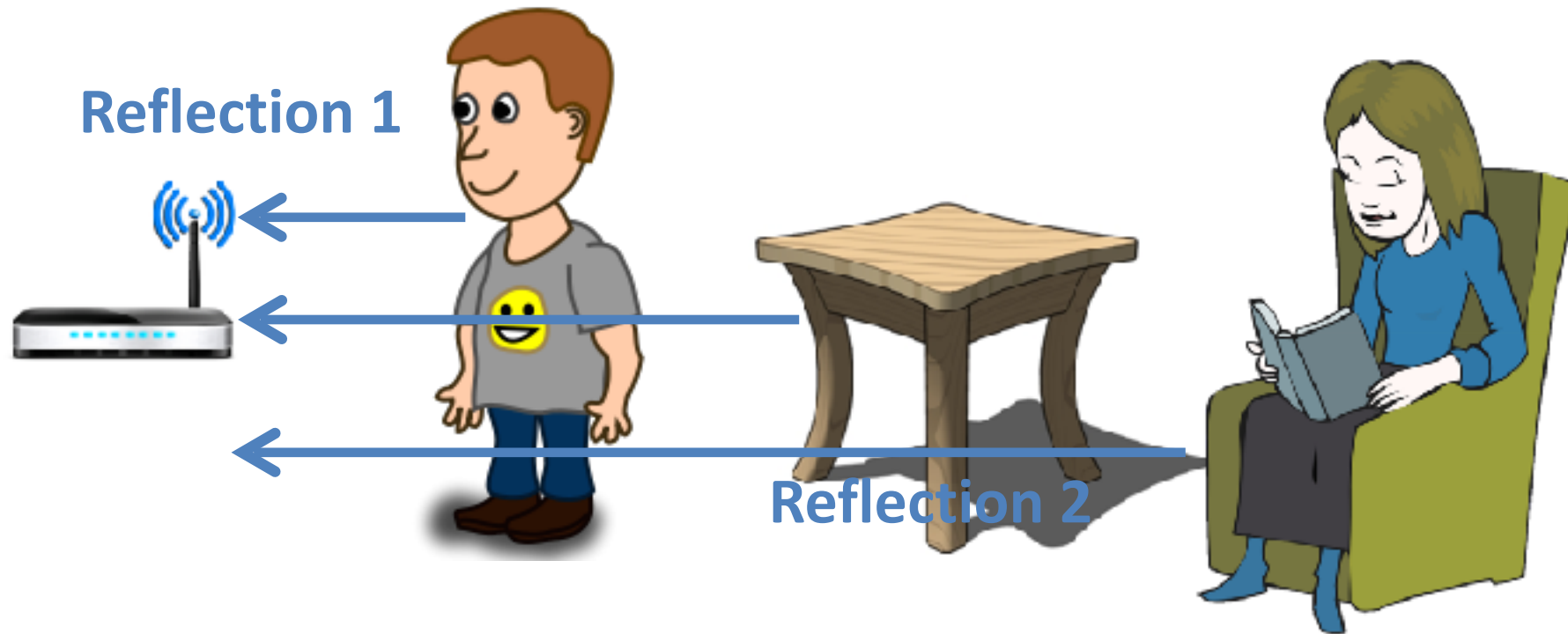


**Band-pass filter the cleaned signals to extract breathing and heart rate**

What happens with multiple users in the environment?

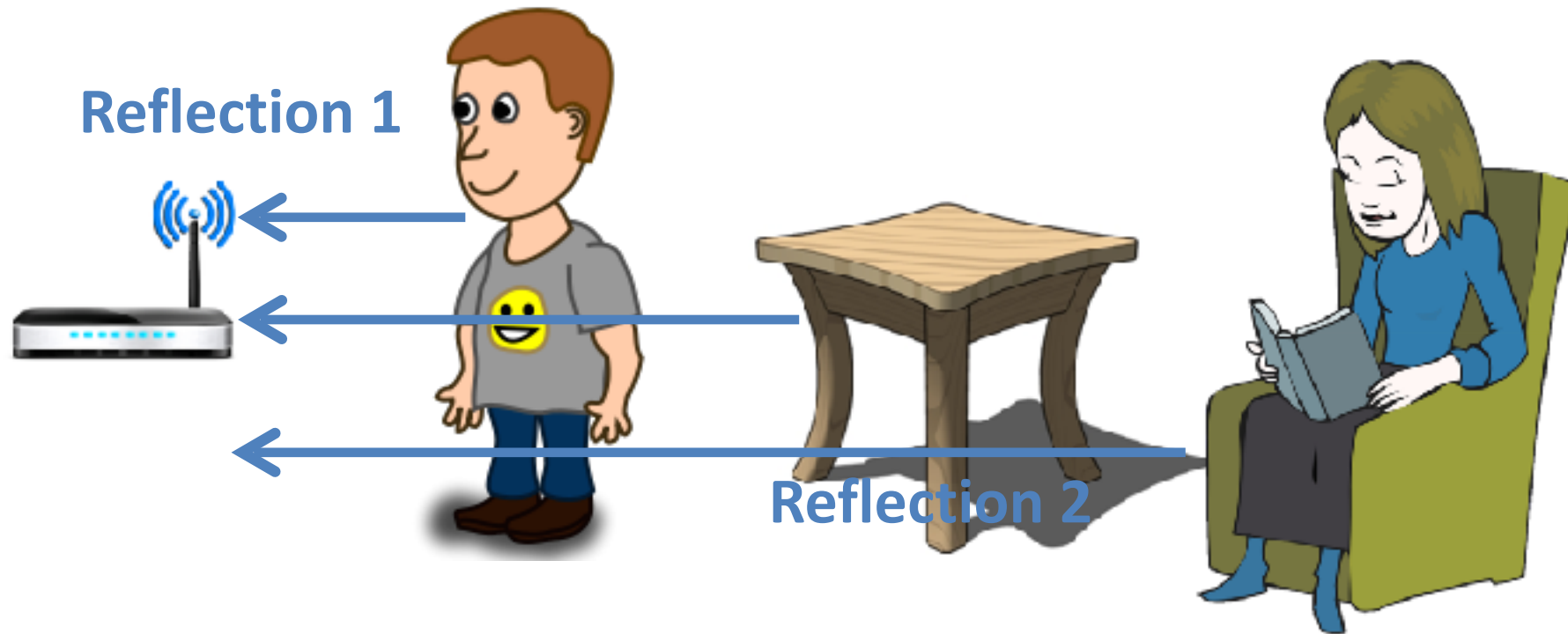
Reflections from different objects **collide**

**Problem: Phase becomes meaningless!**

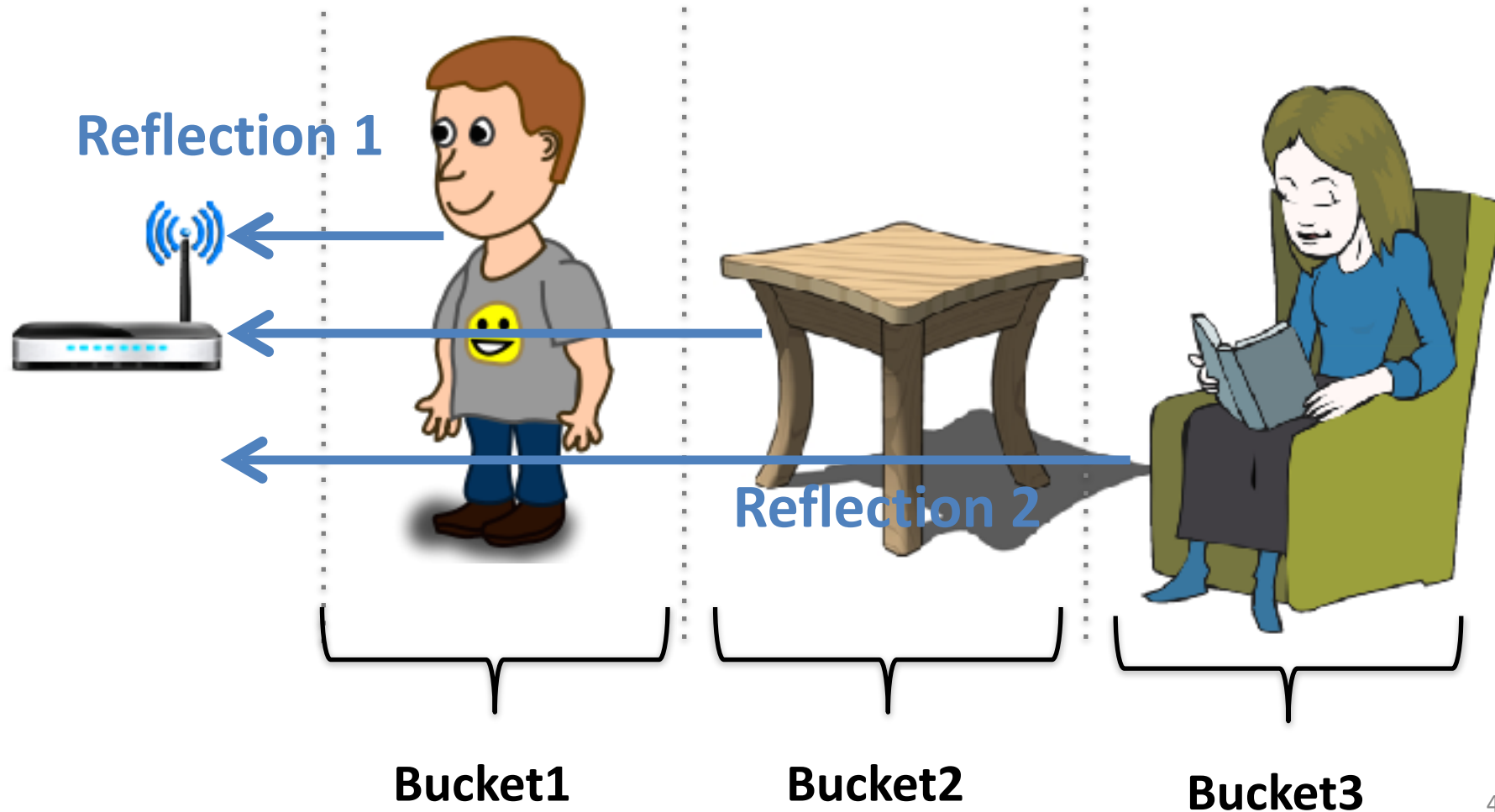




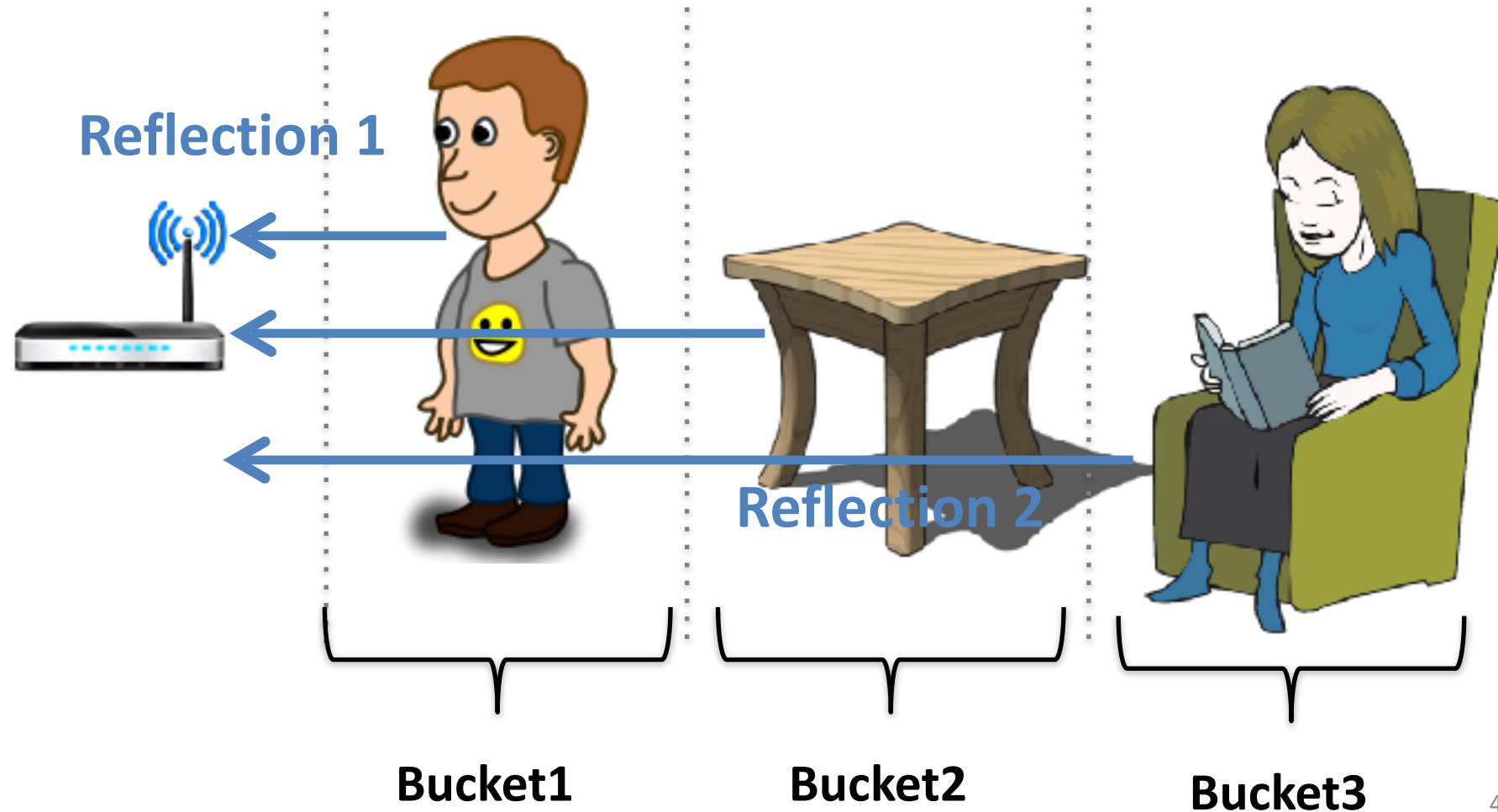
Solution: Use **WiTrack** as a filter to isolate reflections from different positions



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Solution: Use **WiTrack** as a filter to isolate reflections from different positions



# Recall Formulation with FMCW

# Recall Formulation with FMCW

- Output of FFT with reflectors
- Looked at the amplitude only
- Now will also look at phase

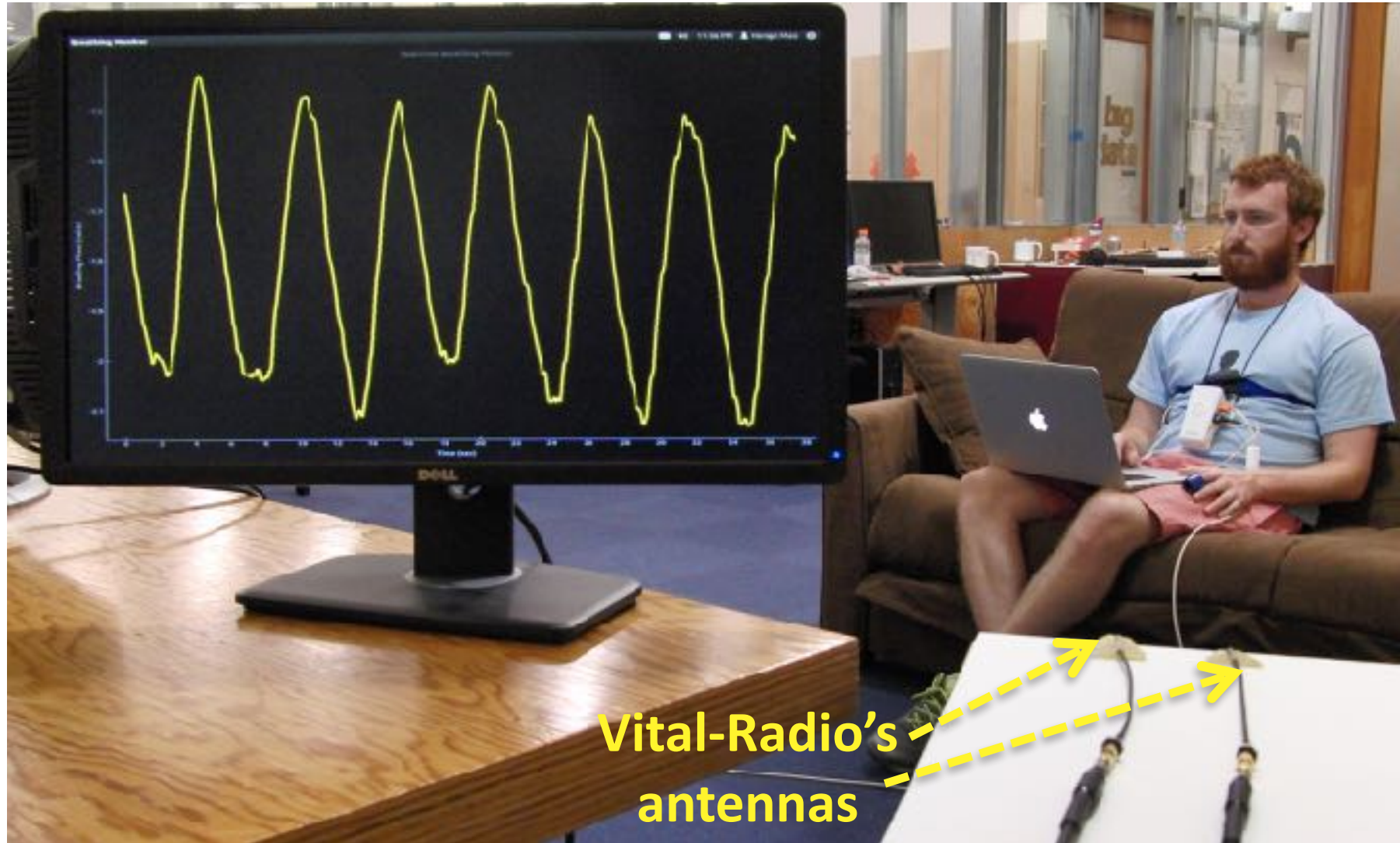
# Putting It Together

**Step 1:** Transmit a wireless signal and capture its reflections

**Step 2:** Isolate reflections from different objects based on their positions

**Step 3:** Zoom in on each object's reflection to obtain phase variations due to vital signs

# Vital-Radio Evaluation



# Vital-Radio Evaluation

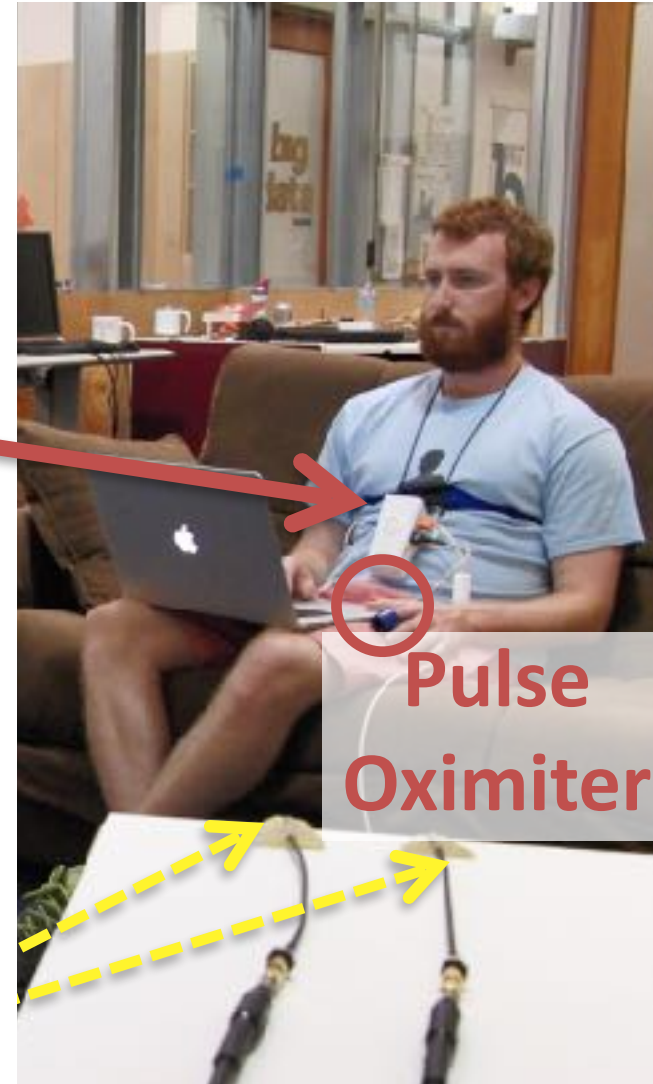
Baseline:

- FDA-approved breathing and heart rate monitor

**Chest Strap**

Experiments:

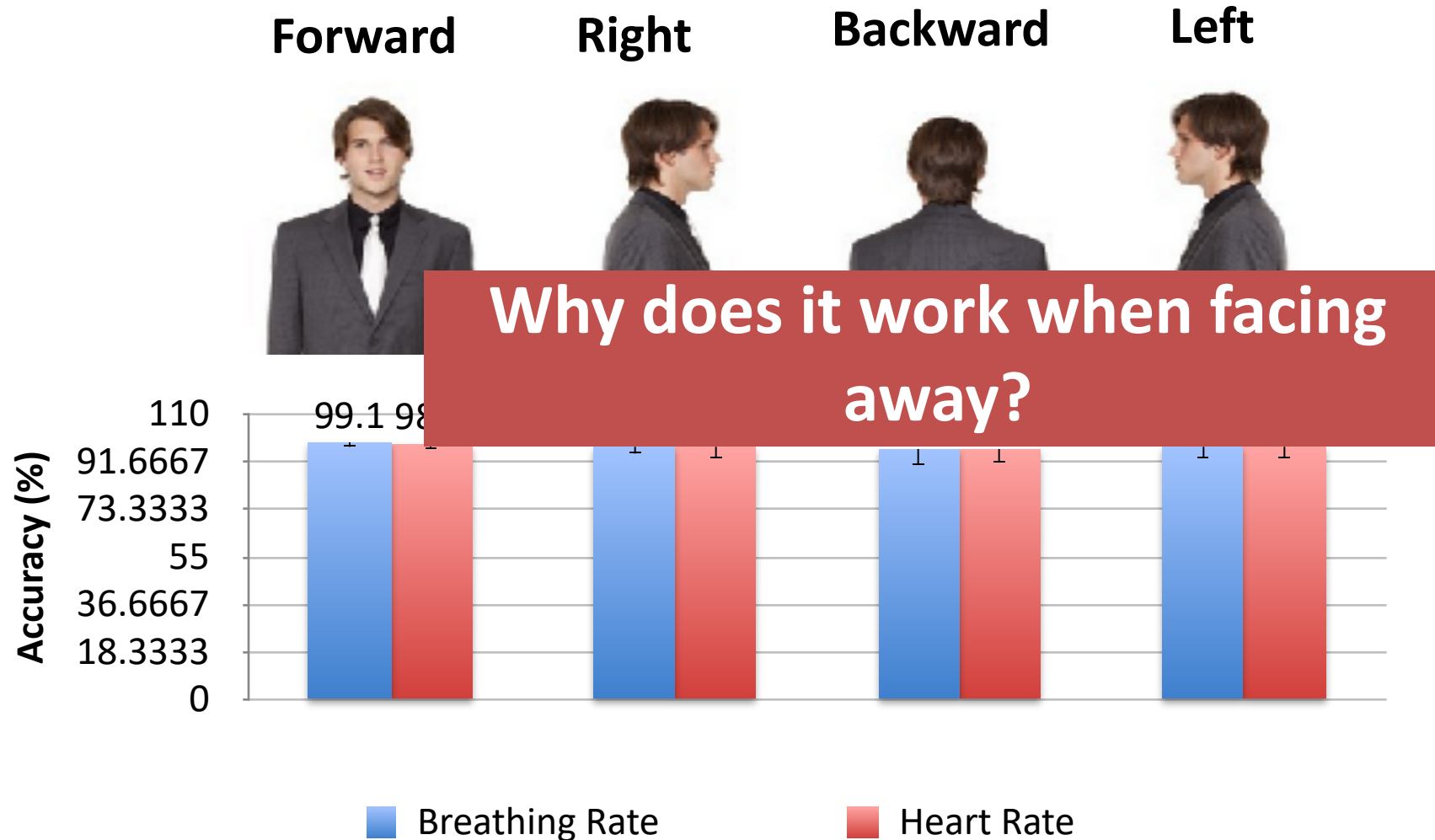
- 200 experiments
- 14 participants
- 1 million measurements





# Accuracy vs. Orientation

User is 4m from device, with different orientations



# Accuracy for Multi-User Scenario

Multiple users sit at different distances



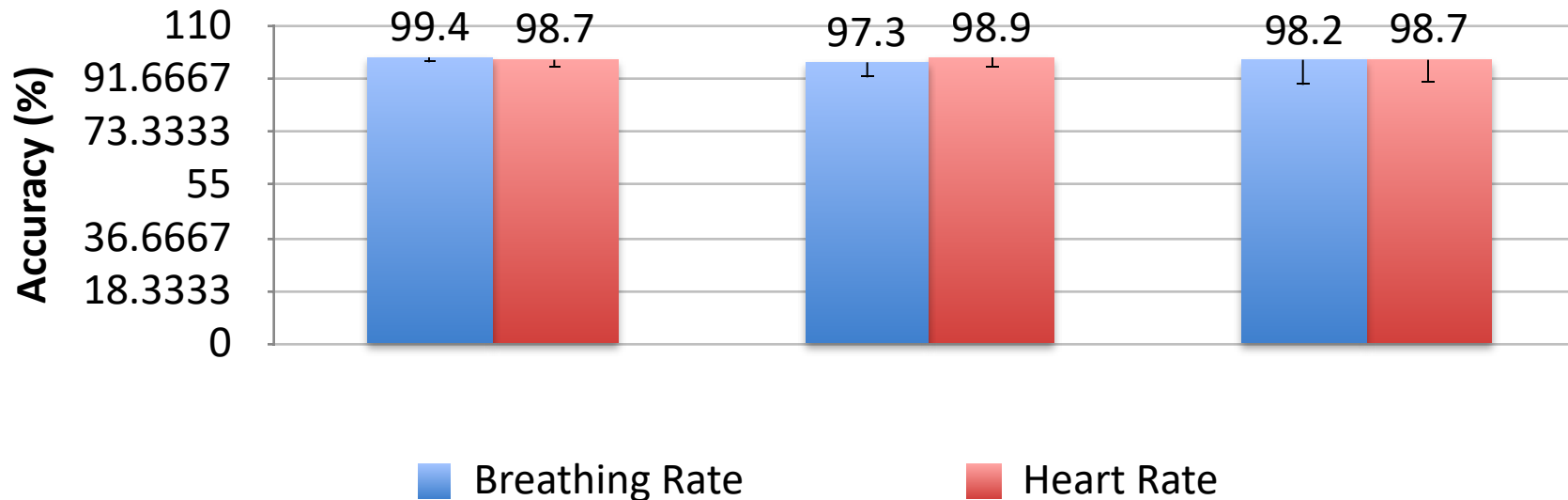
Nearest (at 2m)



Middle (at 4m)

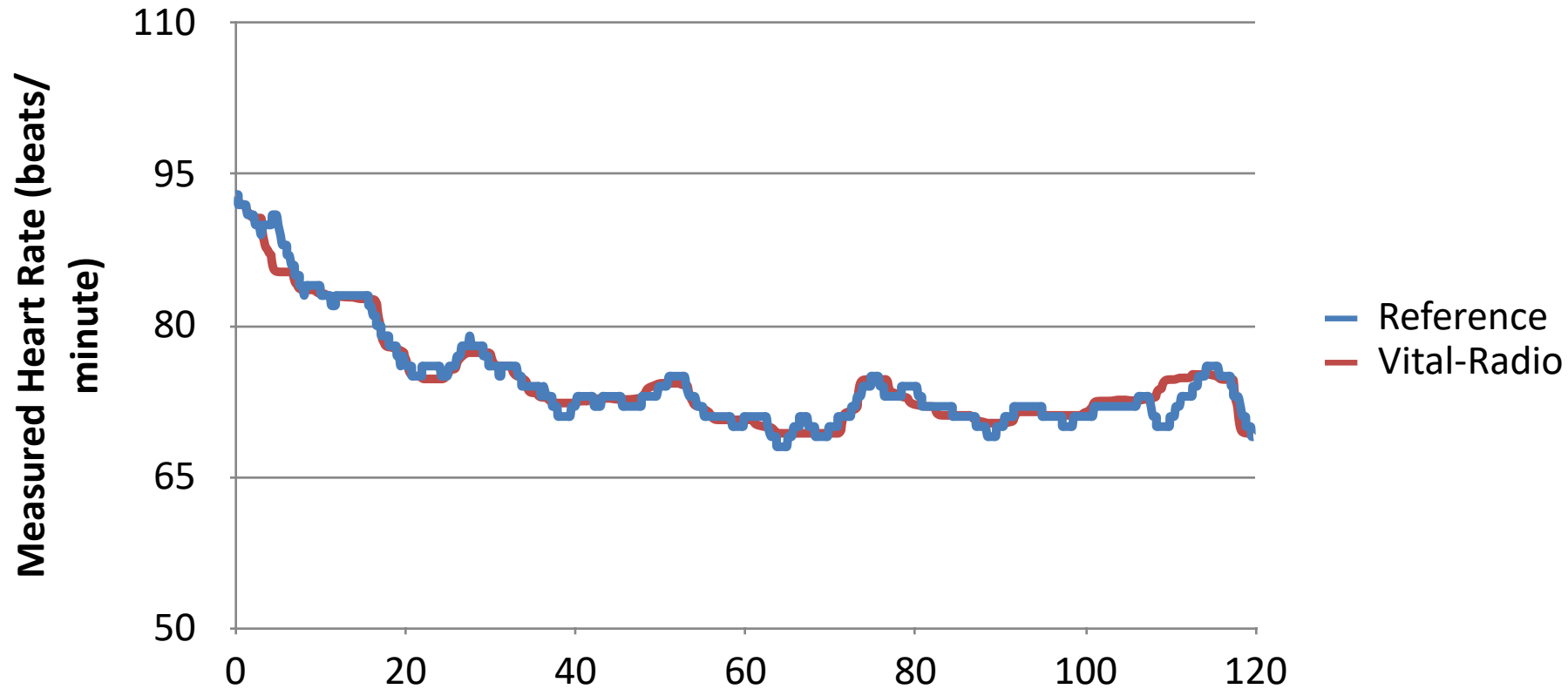


Furthest (at 6m)



# Accuracy for Tracking Heart Rate

Measure user's heart rate after exercising

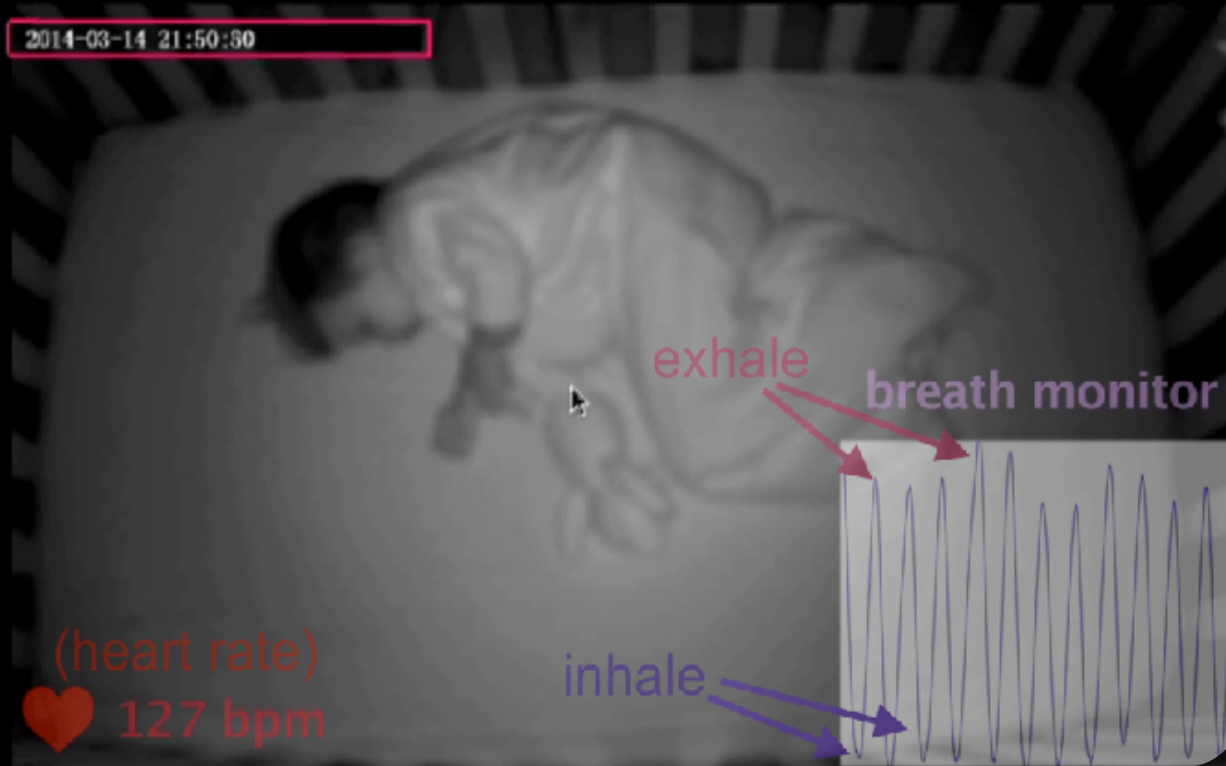


**Vital-Radio accurately tracks changes in vital signs**

# Vital-Radio Limitations

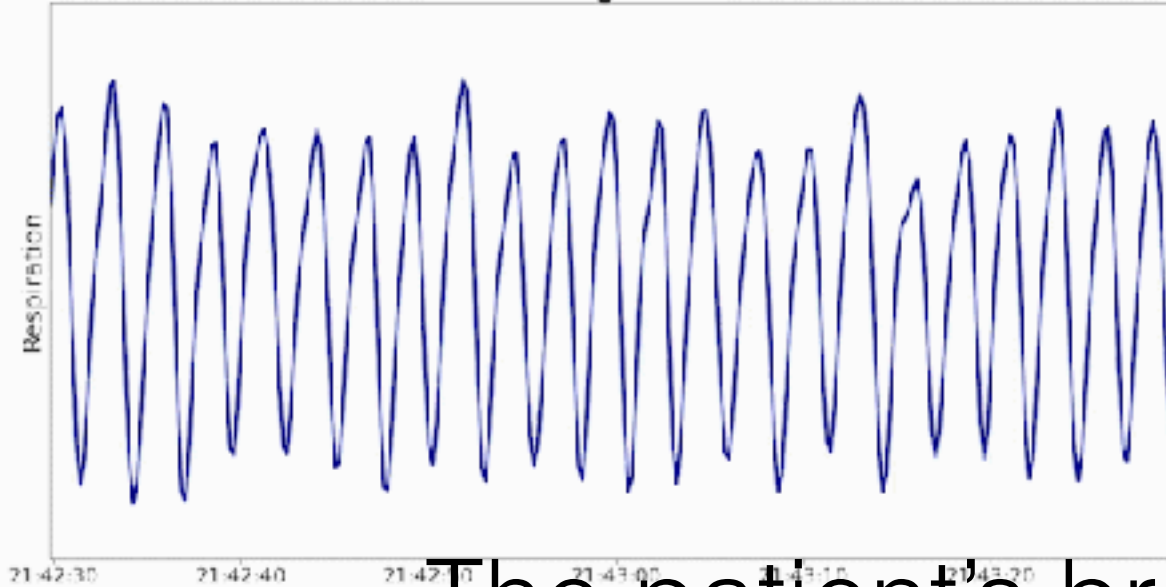
- Minimum separation between users: 1-2m
- Monitoring range: 8m
- Collects measurements when users are quasi-static

# Baby Monitoring

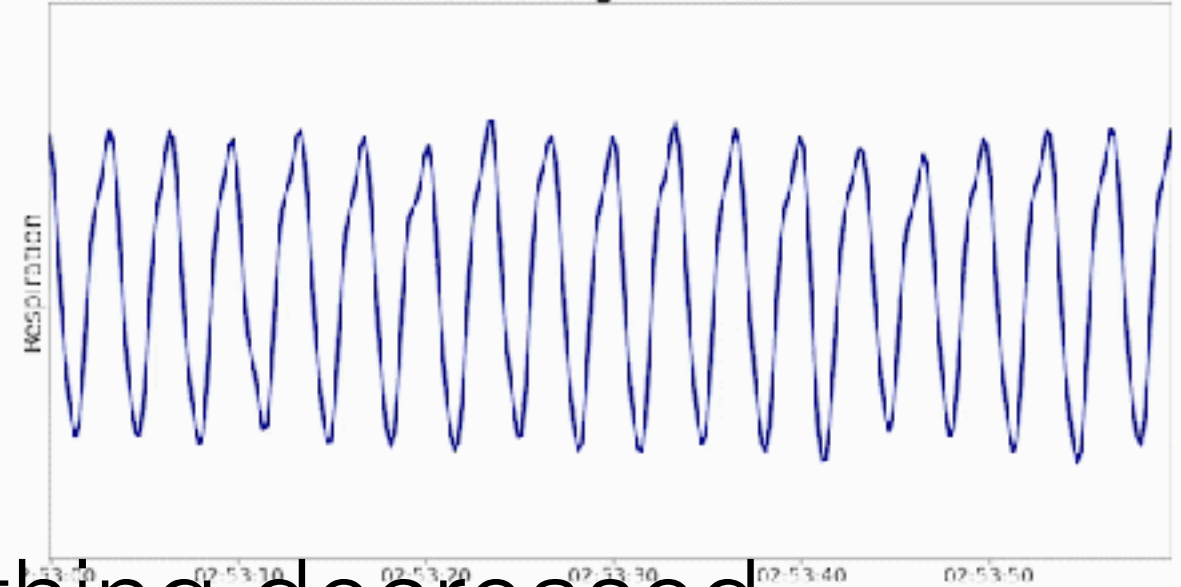


# Monitoring COVID-19 Patient

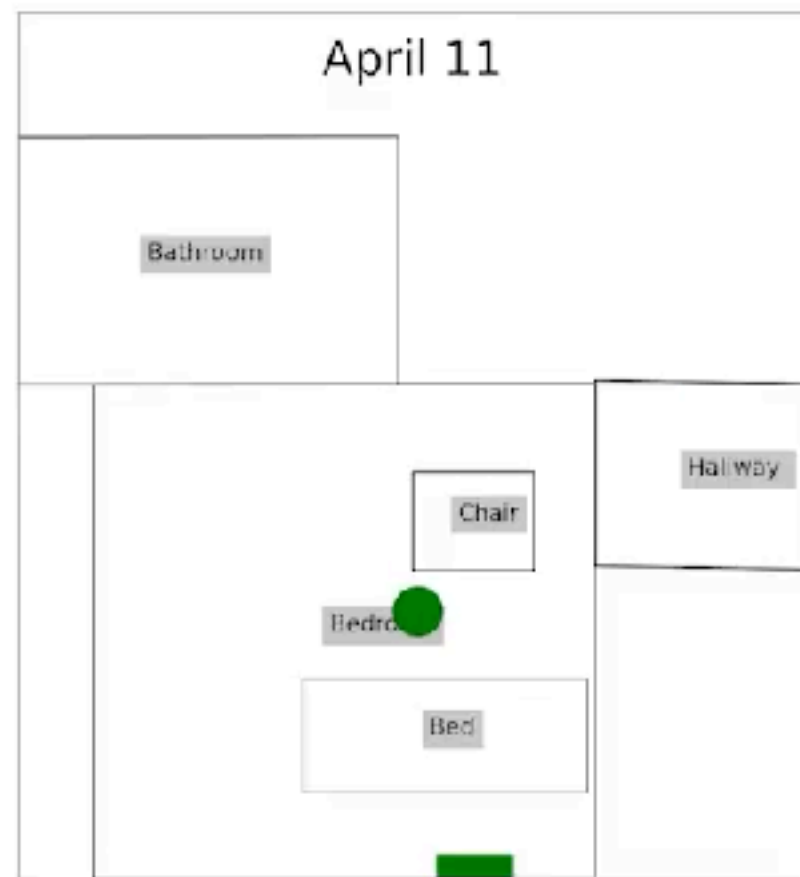
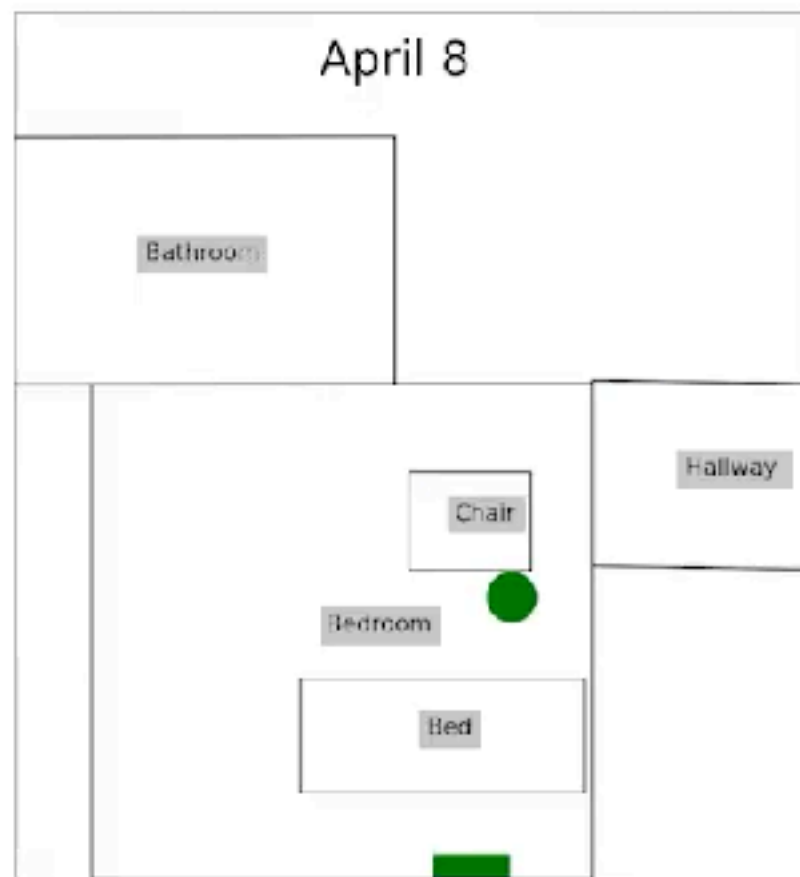
COVID19 Patient - April 7  
Breathing Rate: 23



COVID19 Patient - April 11  
Breathing Rate: 18



The patient's breathing decreased  
as it went back to normal



The patient's movements also demonstrate a marked improvement.

# How can we capture heart recordings?

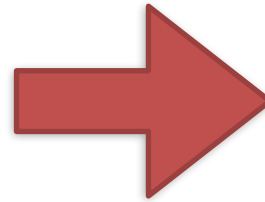


98-99% accuracy in  
timing micro-cardiac  
events

[ACM MobiCom'20]



## Breathing & Heart Rate

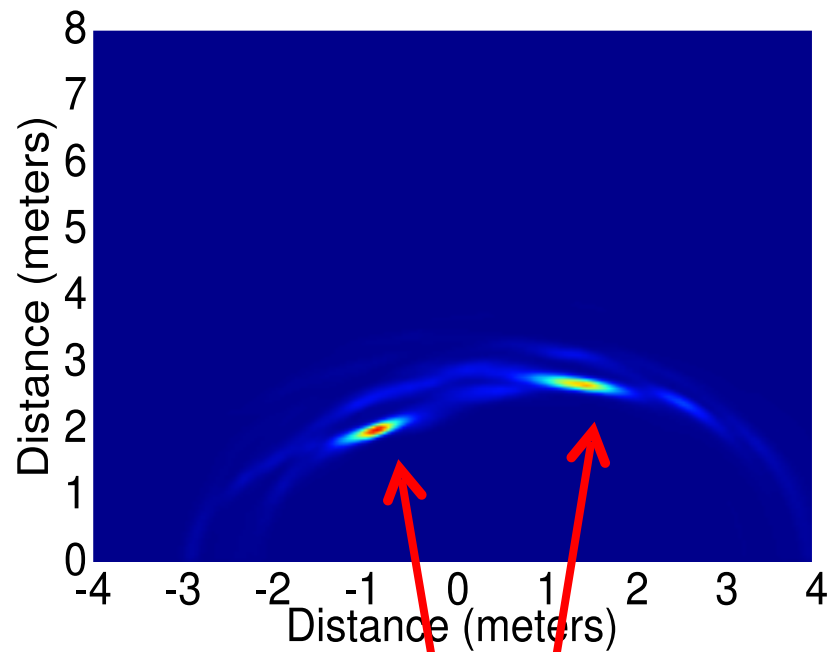


## Want Emotions

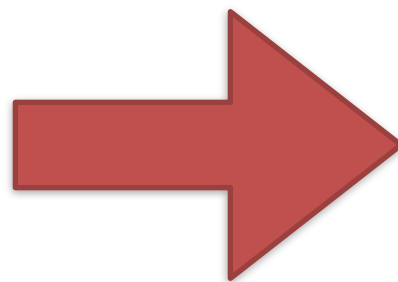


Why and how would you be able to  
get from BR/HR -> emotions?

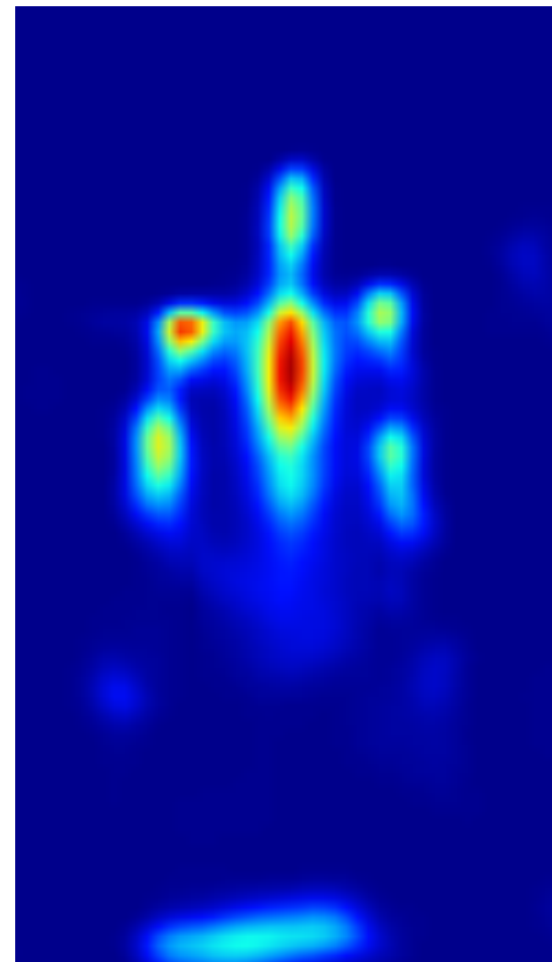
People are points



Localize the two users

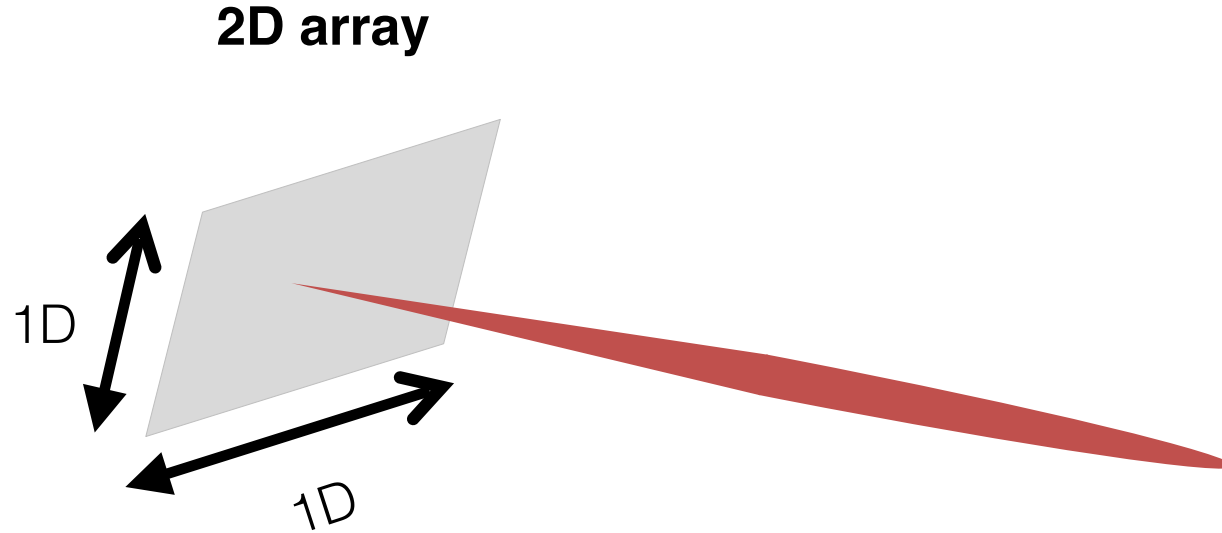


Want a silhouette



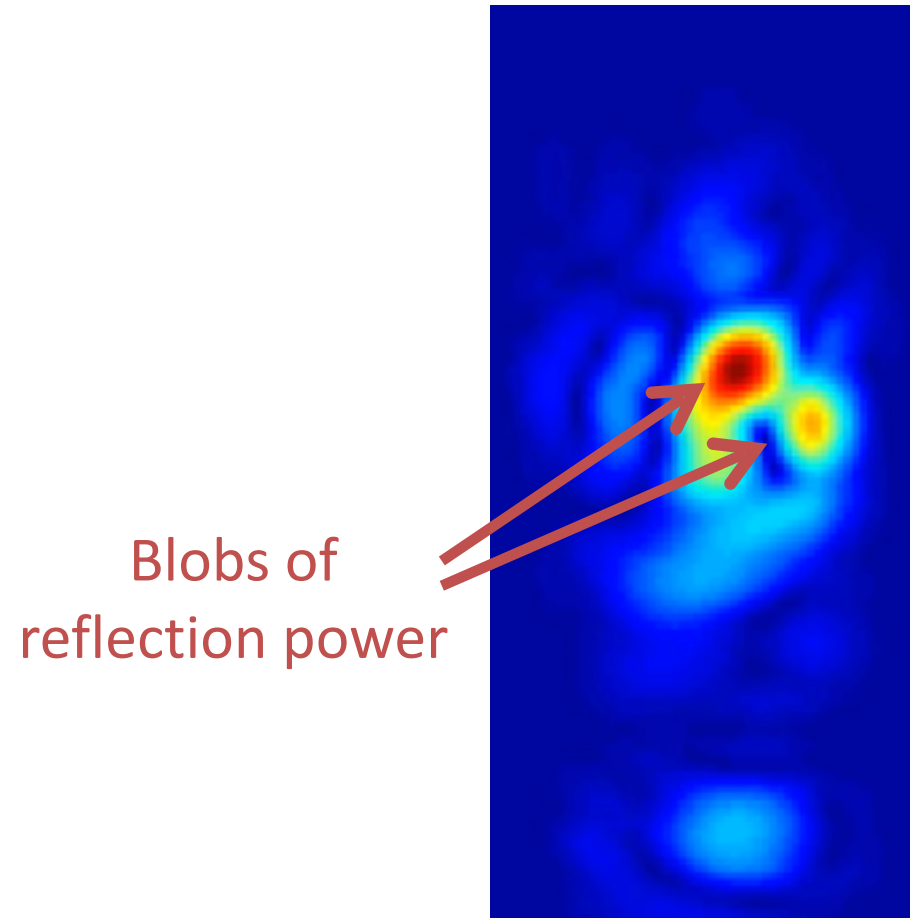
Approach: Combine antenna arrays with FMCW to get 3D image

- 2D Antenna array gives 2 angles
- FMCW gives depth (1D)

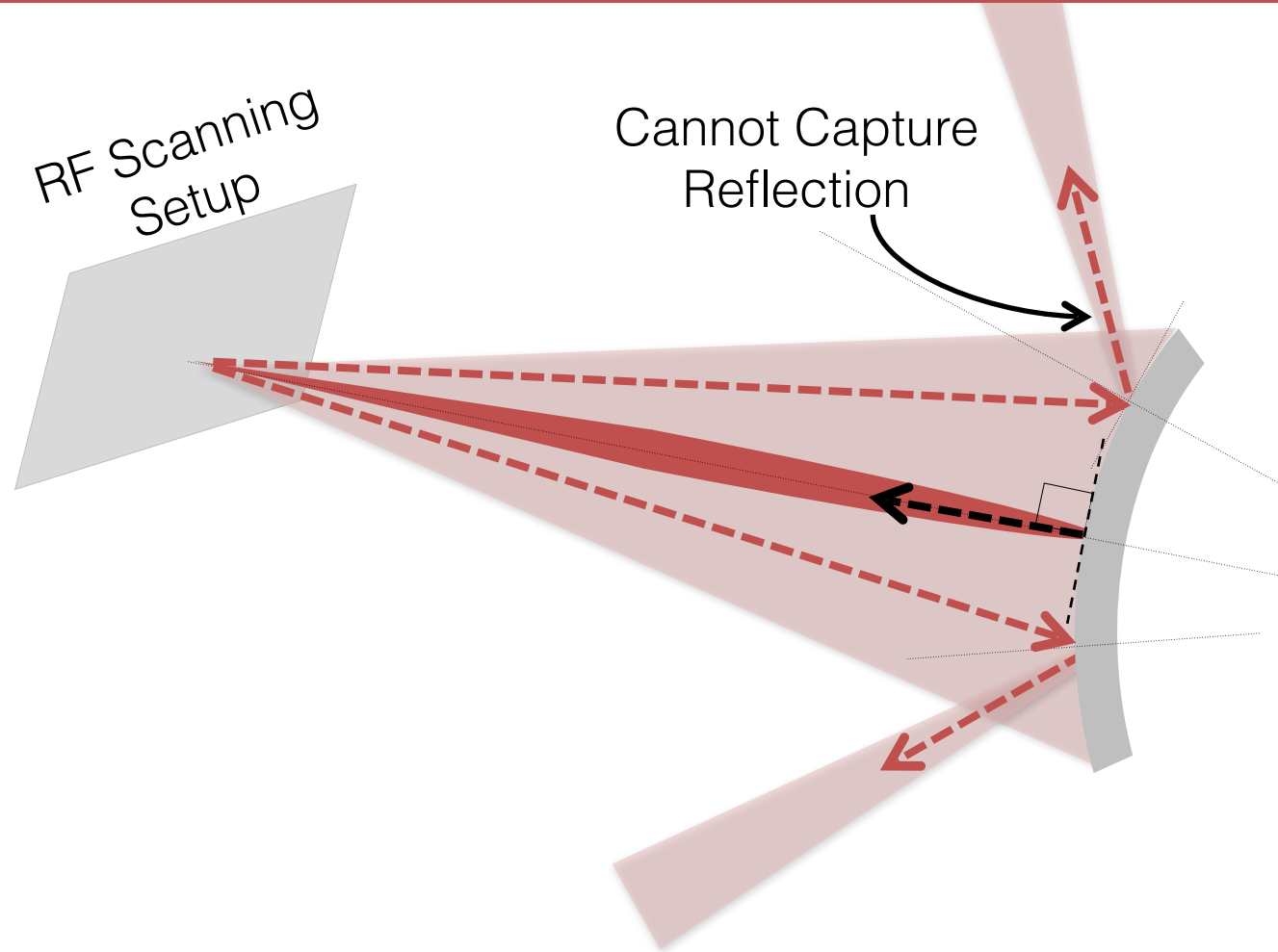


# Challenge: We only obtain blobs in space

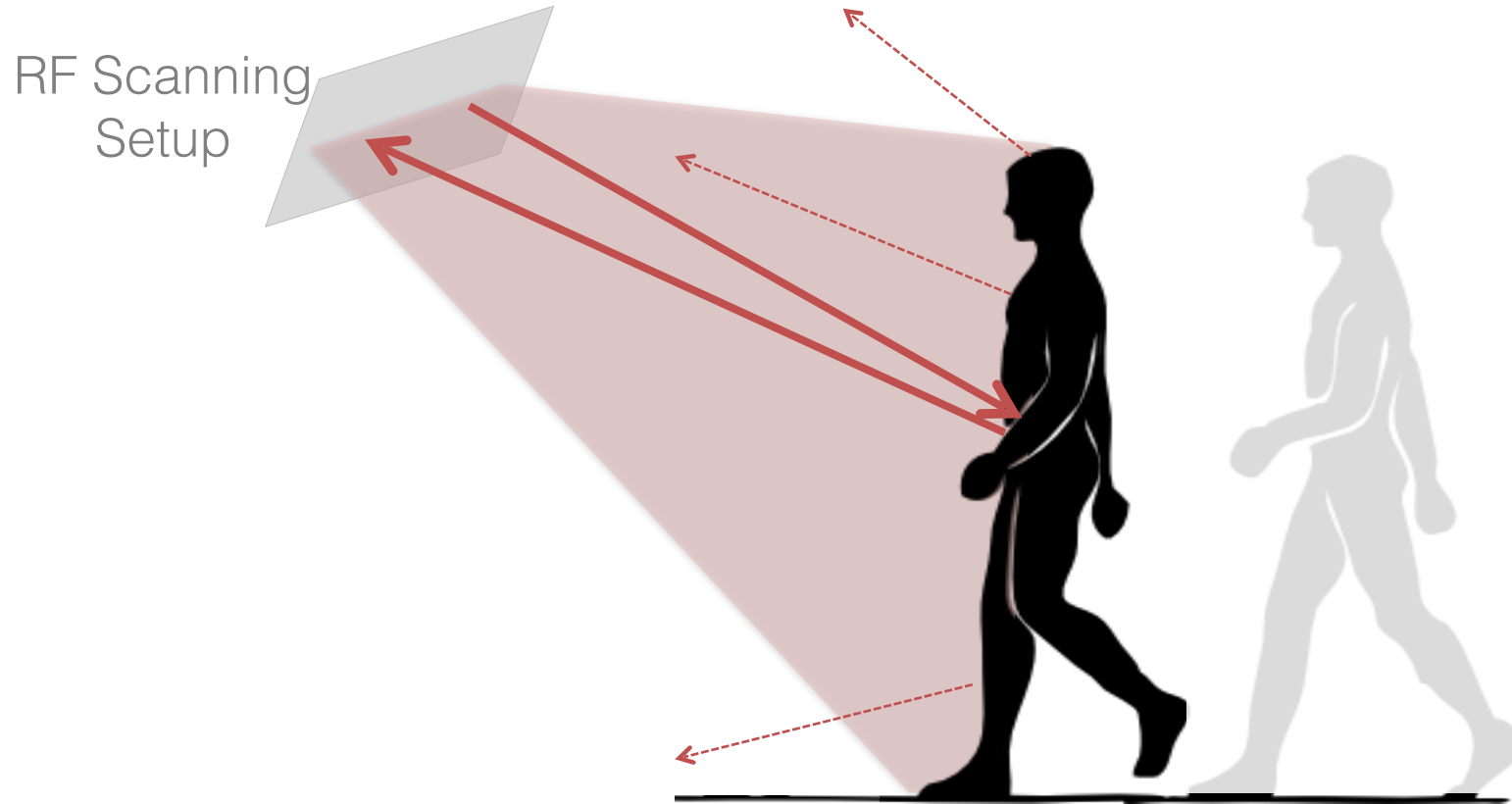
Output of 3D RF Scan



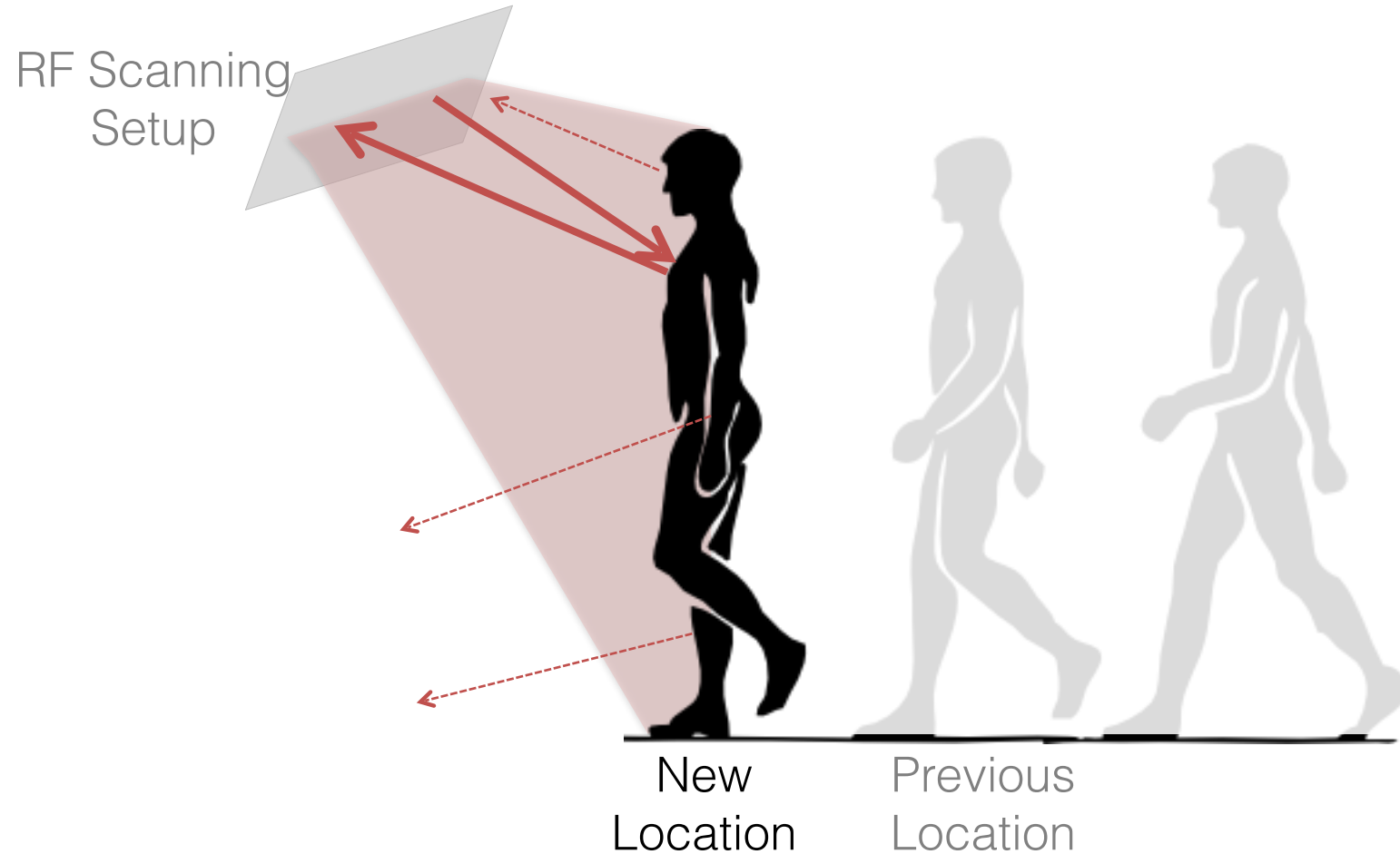
At every point in time, we get reflections from only a subset of body parts.



# Solution Idea: Exploit Human Motion and Aggregate over Time



# Solution Idea: Exploit Human Motion and Aggregate over Time



Combine the various snapshots





# Where is Wireless Sensing today?

## 1. Research-wise:

- Sensitivity: close to ECG in measuring micro-cardiac events (2020)
- Reconstruction: can recover 3D human skeleton + meshes (2020)
- Can monitor new affective metrics: stress levels (2021)
- Technologies: WiFi, millimeter wave, etc.

## 2. Real-world Uses:

- Multiple startups in the space
- Medical use in monitoring 1,000s of patients with Alzheimer's, Parkinson's, COVID-19, Multiple Sclerosis, etc.
- Influenced the design of sensors like Google Soli and others

## 3. Standards:

- Upcoming WiFi standard (802.11bf)
- Planning for 6G

How can you use this technology in the metaverse?

# Objectives of Today's Lecture

Learn the fundamentals, applications, and implications of **contactless wireless sensing**

- ✓ 1. What is wireless (aka WiFi) sensing?
- ✓ 2. How do seeing through wall systems work?
- ✓ 3. How can we monitor human vital signs using wireless signals?
- ✓ 4. What are the industry opportunities and societal implications of wireless sensing (today and in the near+far future)?

# How to Wirelessly Sense Almost Anything



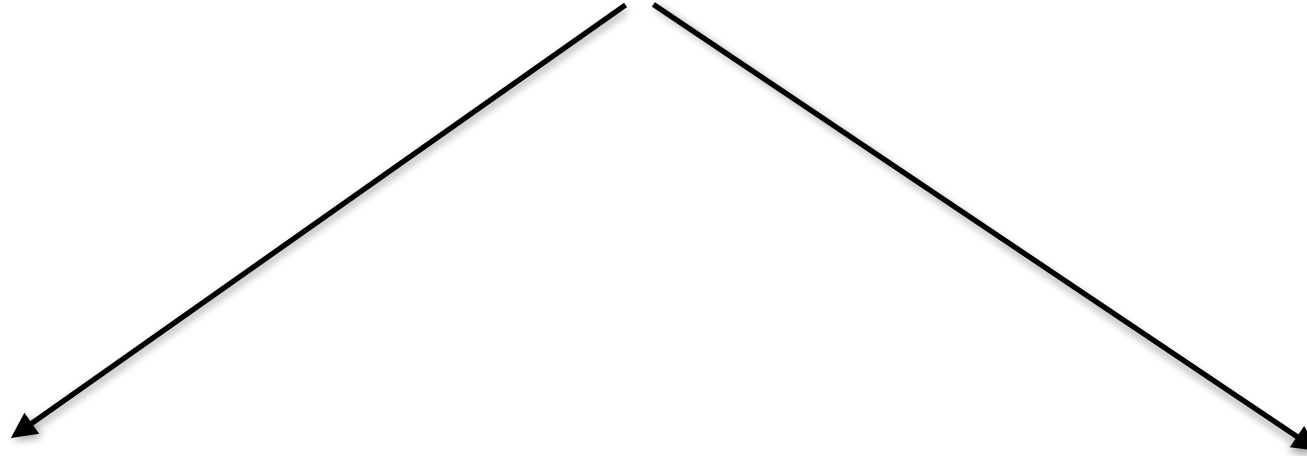
```
graph TD; A[How to Wirelessly Sense Almost Anything] --> B[sensing the physical world & transmitting data wirelessly]; A --> C[sensing via the wireless signals themselves];
```

sensing the physical world &  
transmitting data wirelessly

sensing via the wireless  
signals themselves

So far

# How to Wirelessly Sense Almost Anything



sensing the physical world &  
transmitting data wirelessly

next

sensing via the wireless  
signals themselves

# Next Class: Wireless Communications

## 1) Required

- The Wireless Channel (Chapter) - summary required
- Underwater-to-Air Communications - review required

## 2) Optional

- 802.11n+: Random Access Heterogeneous MIMO Networks
- ZigZag Decoding: Combating Hidden Terminals in Wireless Networks
- Full-Duplex Practical, Real-time, Full Duplex Wireless

