

6.S062: Mobile and Sensor Computing

Lecture 4: Device-Free Localization

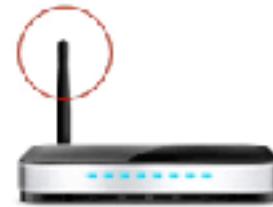
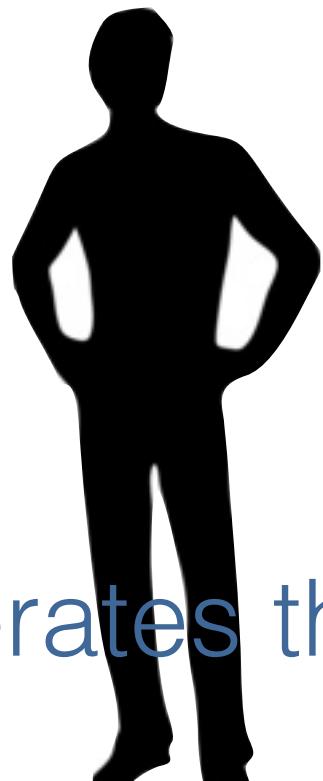


So Far: Device-based Localization



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

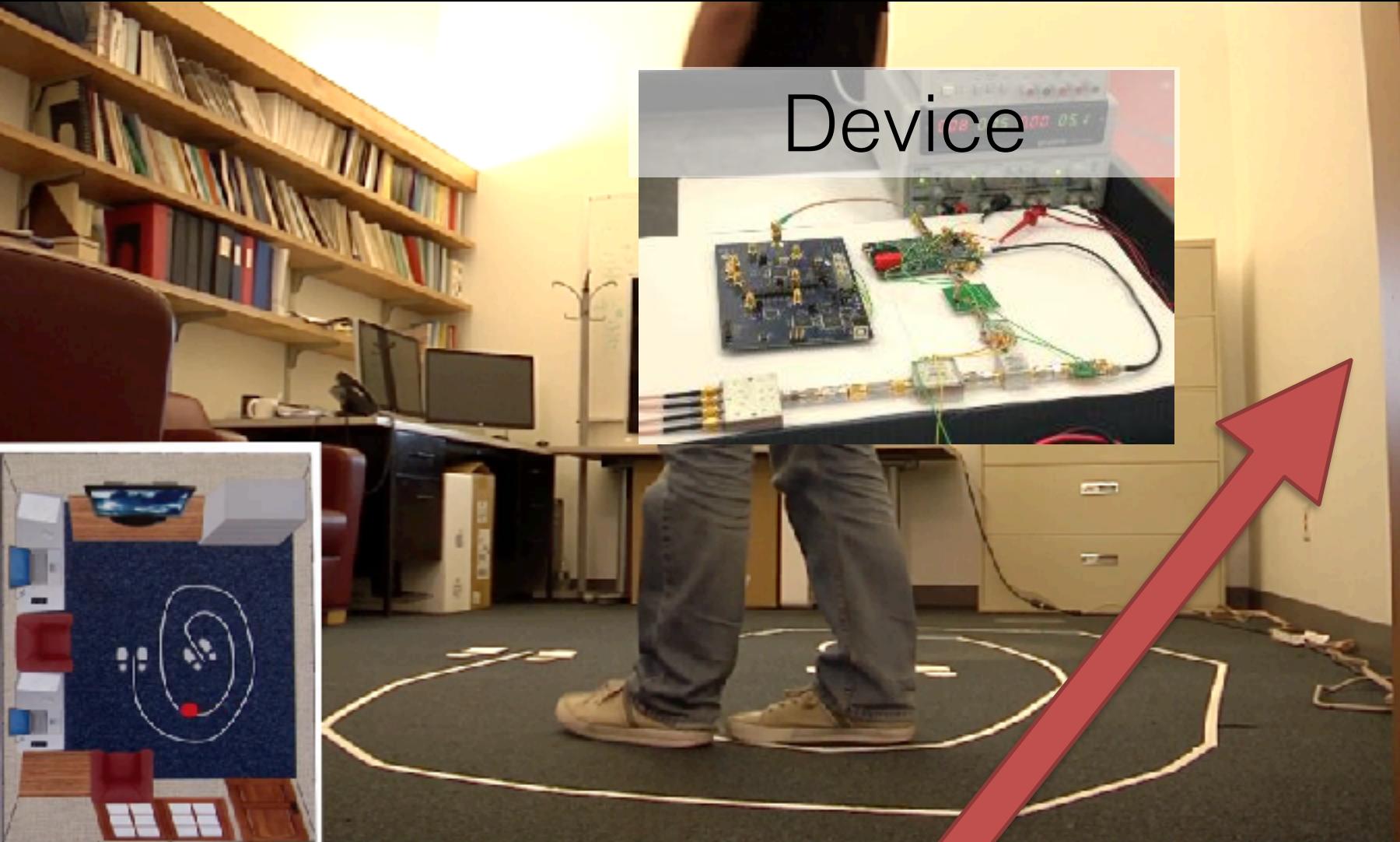
This Lecture: Using radio signals to track humans without any sensors on their bodies



- Location
- Vital Signs
- Gestures

Operates through occlusions

Example: WiTrack



Device in another room

Applications

Smart Homes



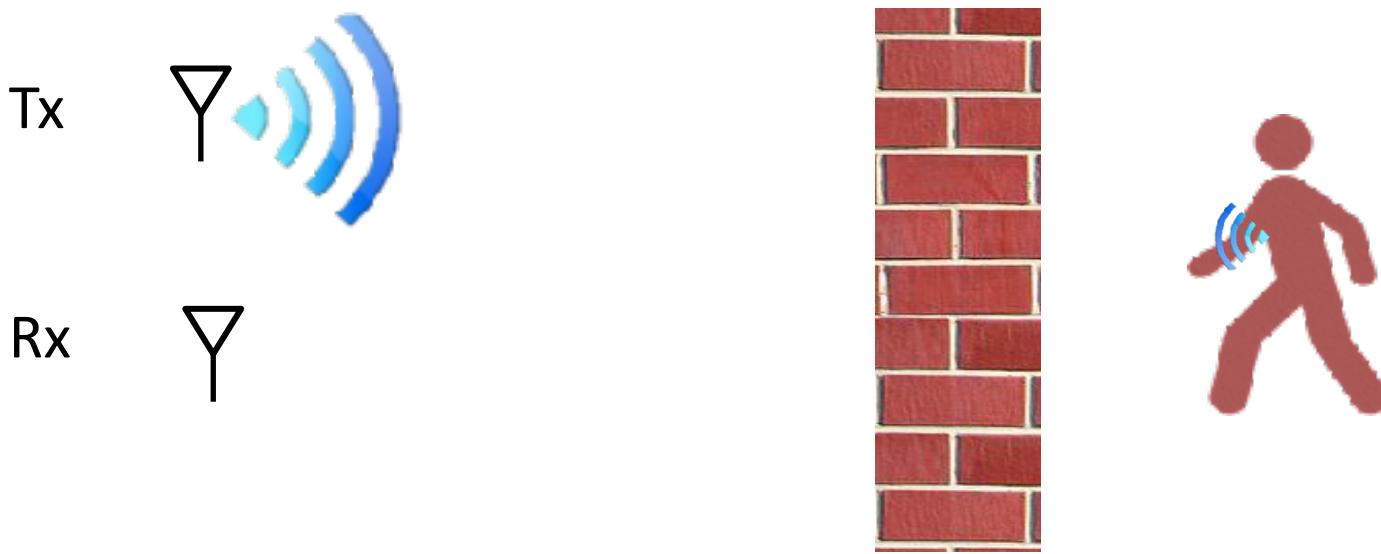
Energy Saving



Gaming & Virtual Reality



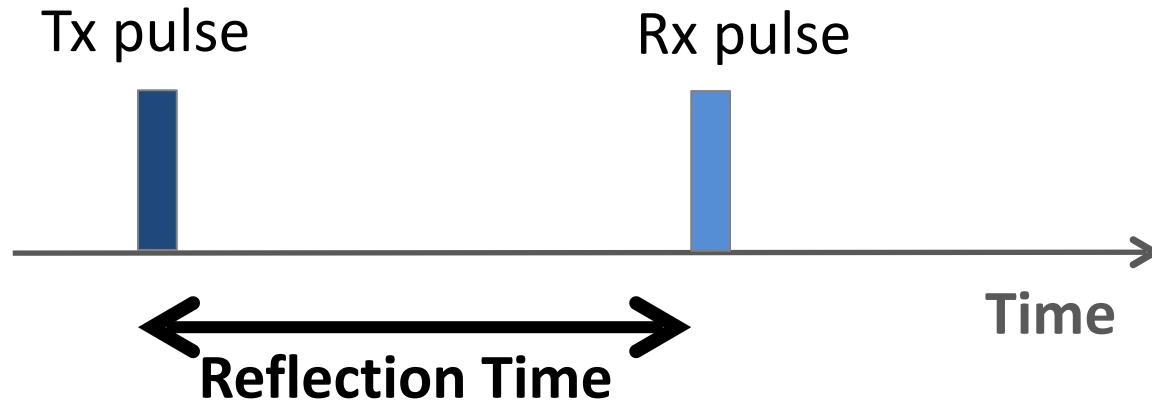
Measuring Distances



Distance = **Reflection time** x speed of light

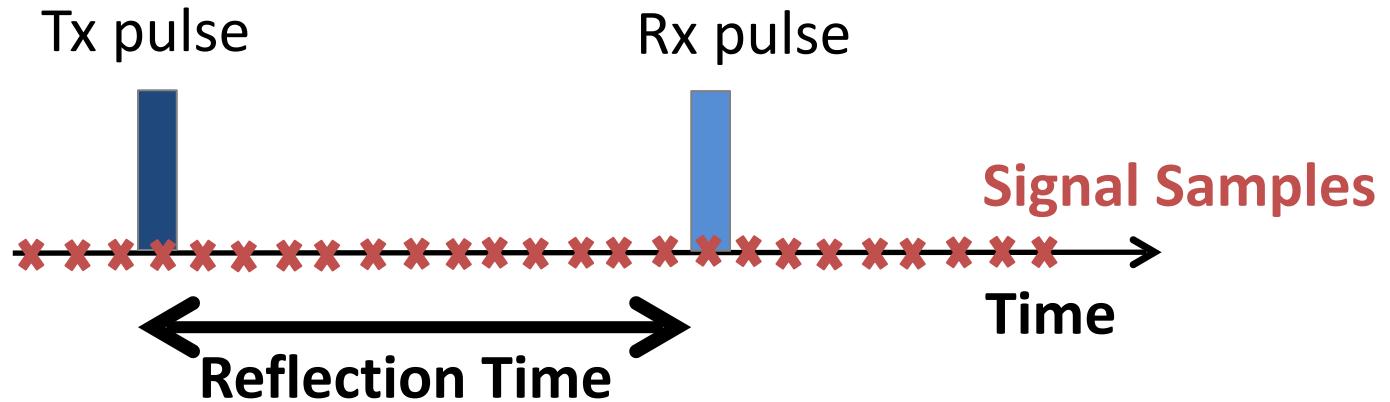
Measuring Reflection Time

Option1: Transmit short pulse and listen for echo



Measuring Reflection Time

Option1: Transmit short pulse and listen for echo



Capturing the pulse needs sub-nanosecond sampling

Why?

Capturing the pulse needs sub- nanosecond sampling

Why?

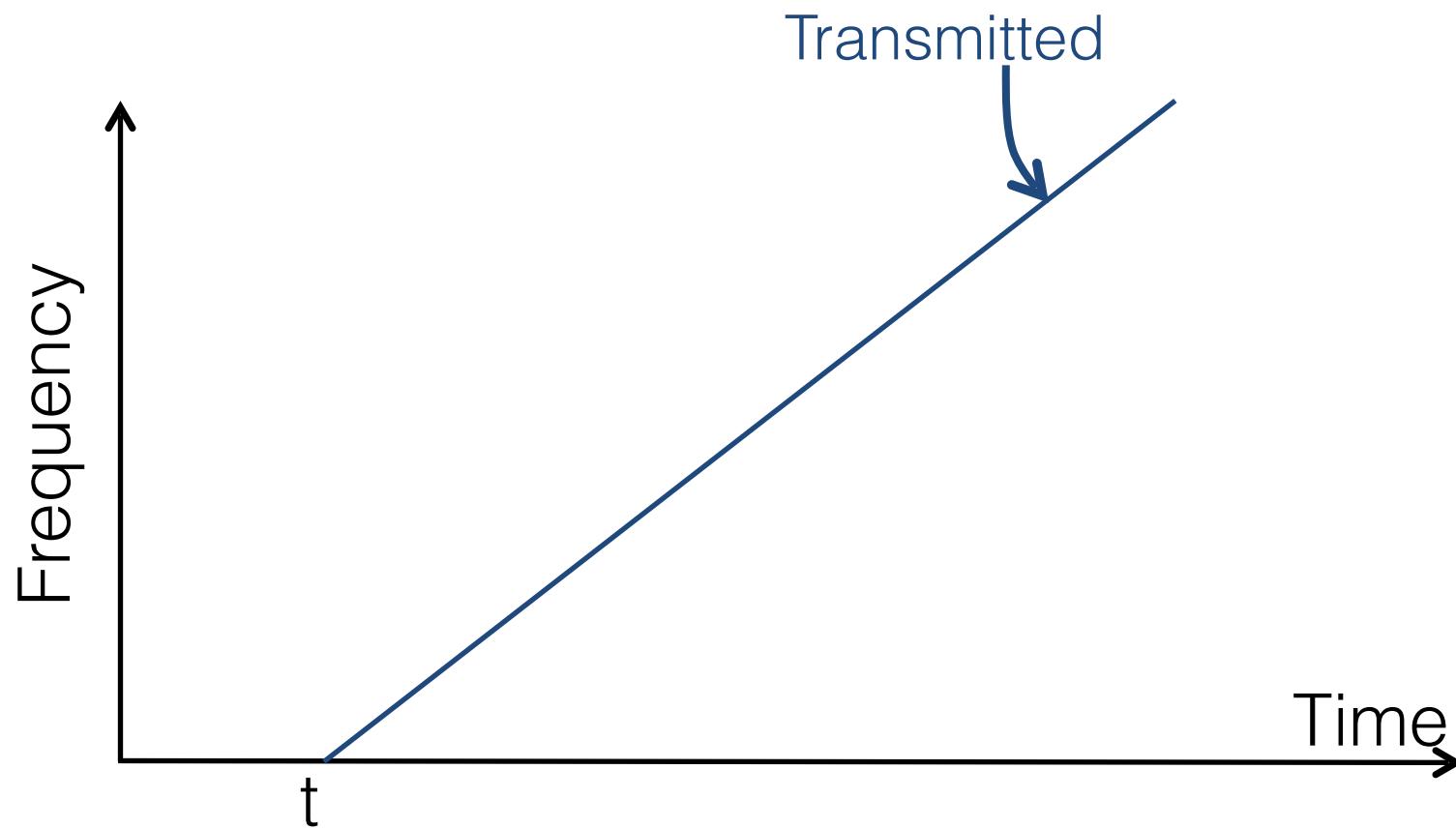
Multi-GHz samplers are expensive, have high noise, and create large I/O problem

Why was this not a problem for Cricket?

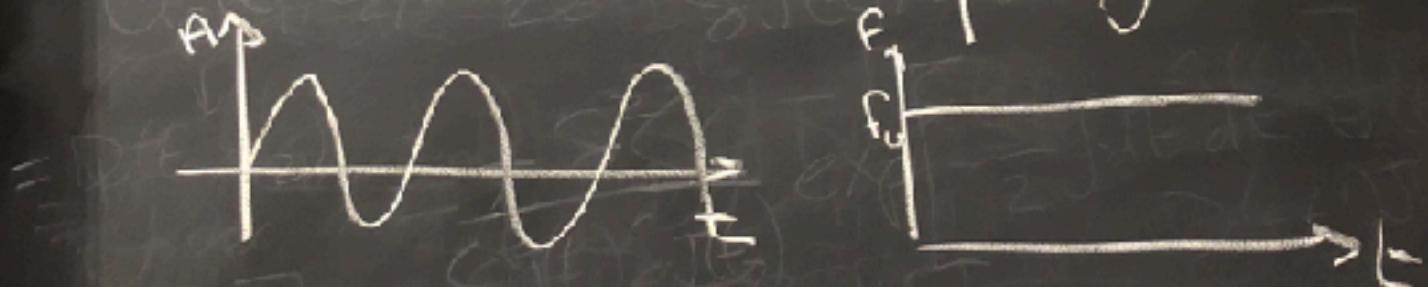
$$\begin{aligned} \text{Sampling freq.} &= \frac{1}{\text{time resolution}} \\ &= 3 \times 10^9 \\ &= 3 \text{ GSps} \\ &\text{"Huge"} \end{aligned}$$

$$\begin{aligned} \text{Distance} &= \text{time} \times \text{speed} \\ \text{"smallest distance resolution"} &= \text{"smallest time"} \times \text{speed} \\ 10 \text{ cm} &= \Delta t \times c \\ \Delta t &\approx \frac{1}{3} \times 10^{-9} = 0.3 \text{ ns} \\ \text{"Cricket" ultrasound} &\Rightarrow 300 \text{ m/s} \text{ vs } 3 \times 10^9 \\ &\Rightarrow 10^6 \text{ slower} \\ &\sim 3 \text{ KSPS} \end{aligned}$$

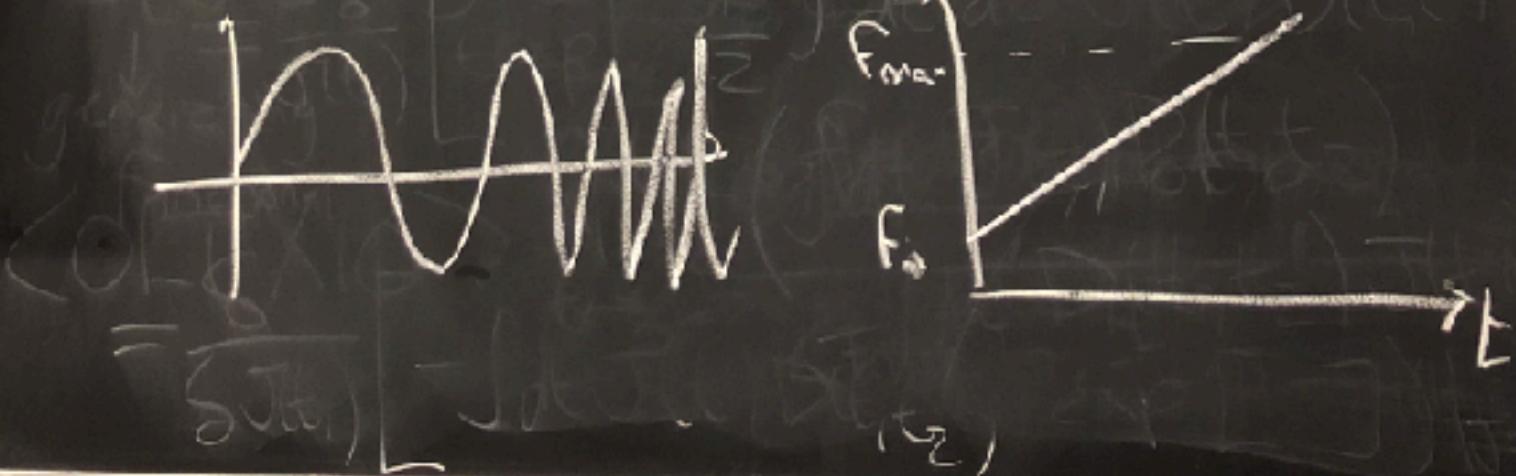
FMCW: Measure time by measuring frequency



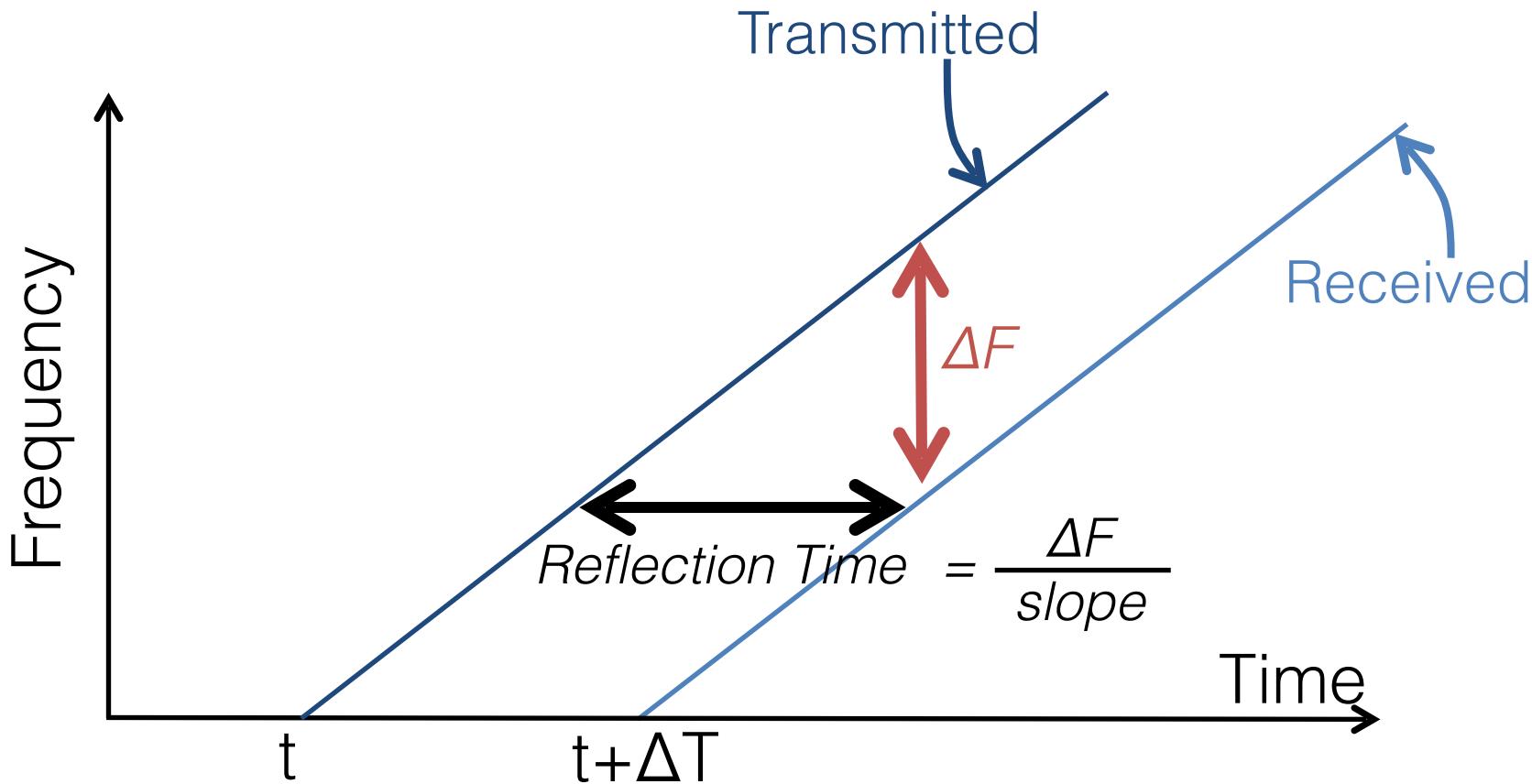
* Wireless Signal @ frequency f



* FMCW (chirp)



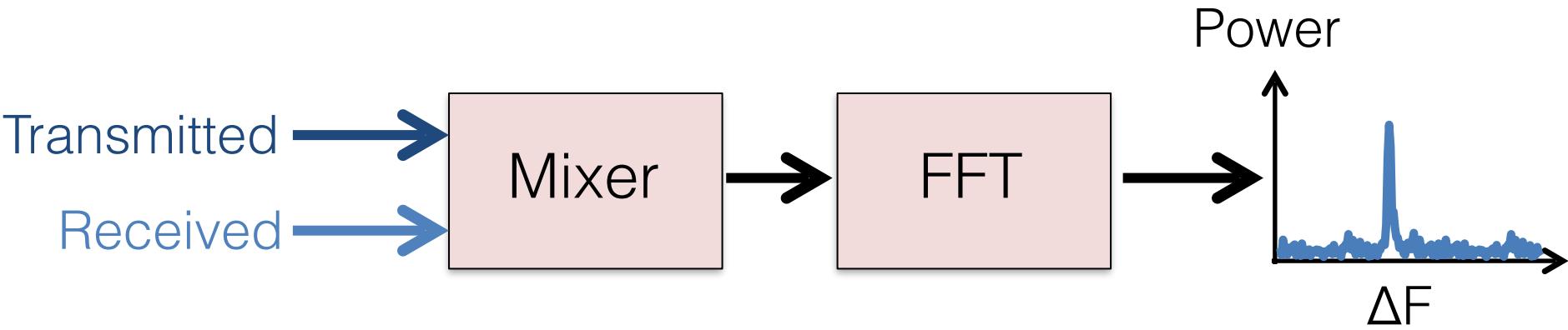
FMCW: Measure time by measuring frequency



How do we measure ΔF ?

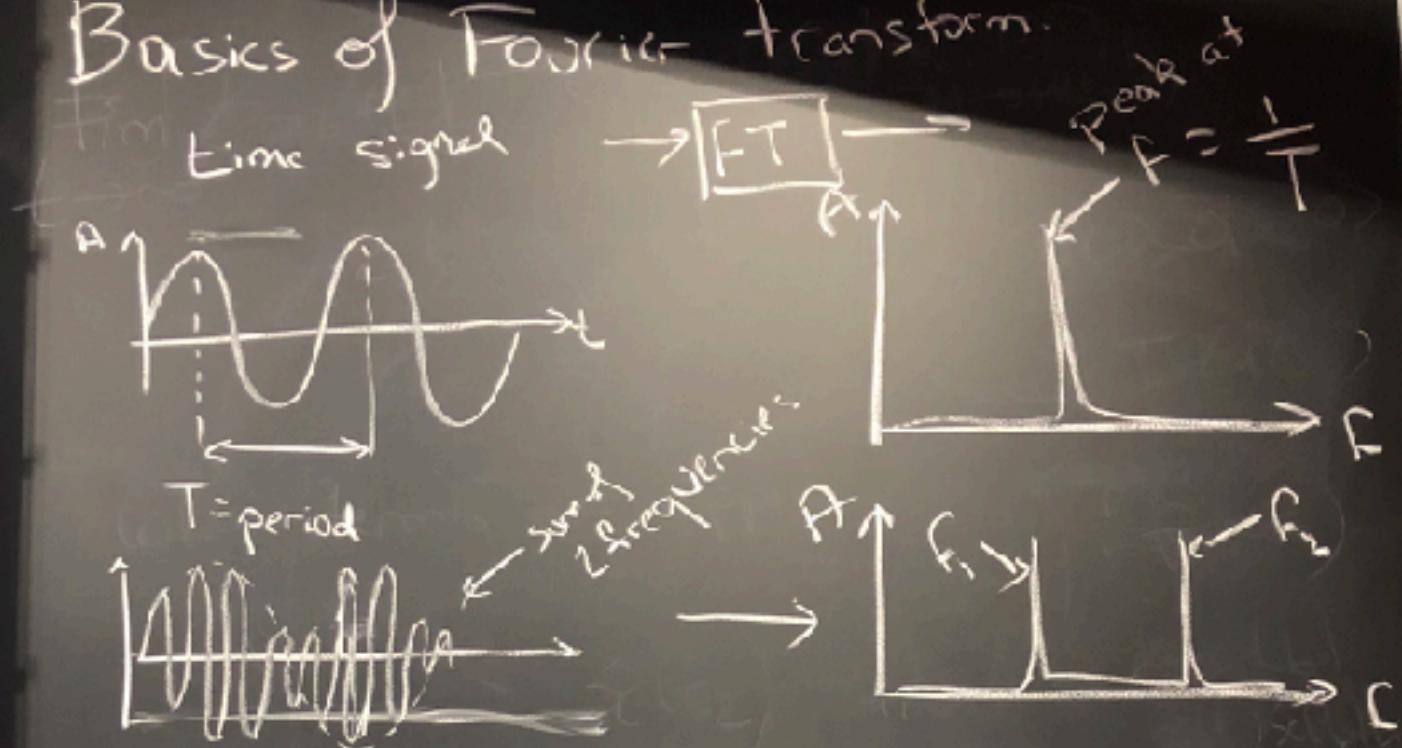
Measuring ΔF

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



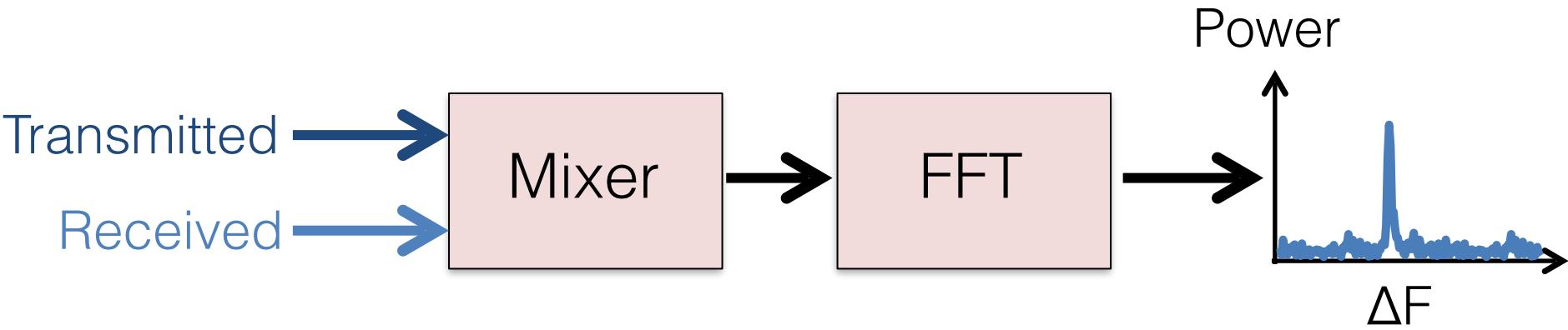
Signal whose frequency is ΔF

Basics of Fourier transform.



Measuring ΔF

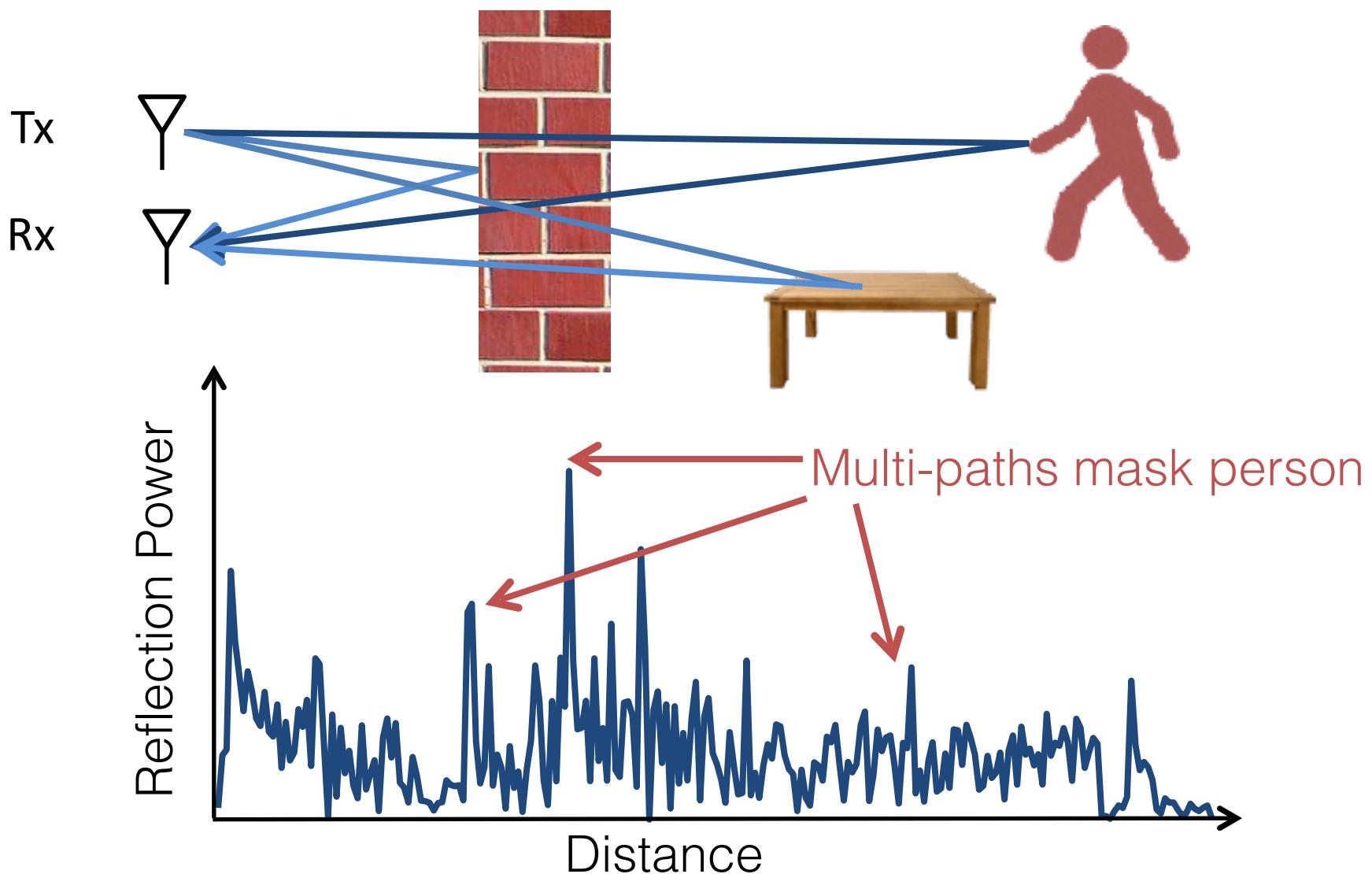
- Subtracting frequencies is easy (e.g., removing carrier in WiFi)
- Done using a mixer (low-power; cheap)



Signal whose frequency is ΔF

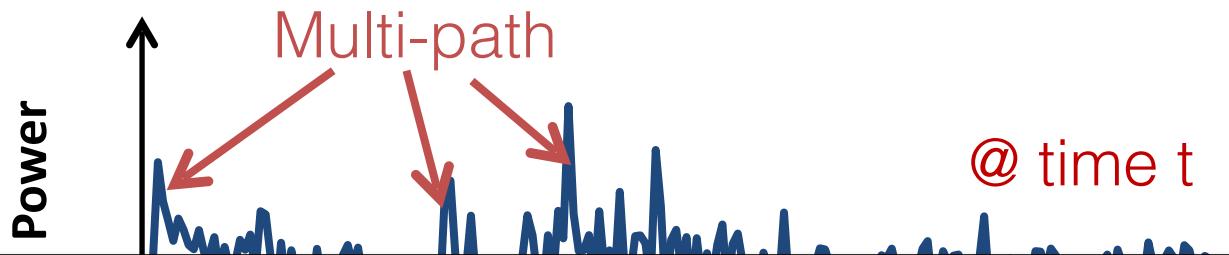
$\Delta F \rightarrow$ Reflection Time \rightarrow Distance

Challenge: Multipath → Many Reflections

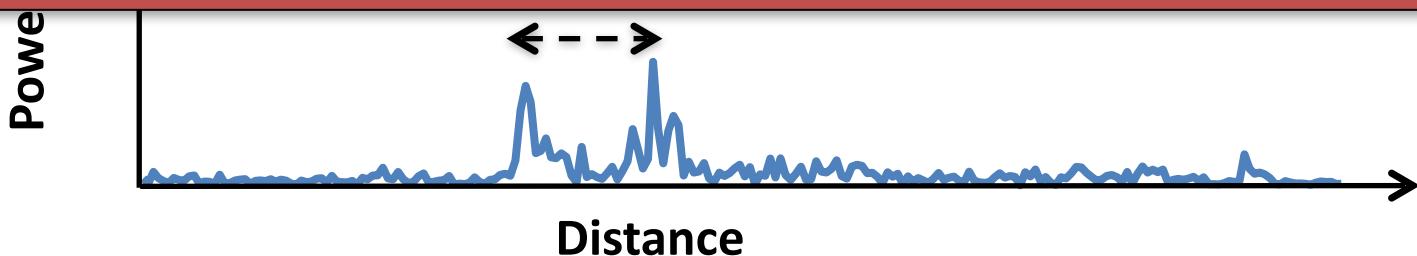


Static objects don't move

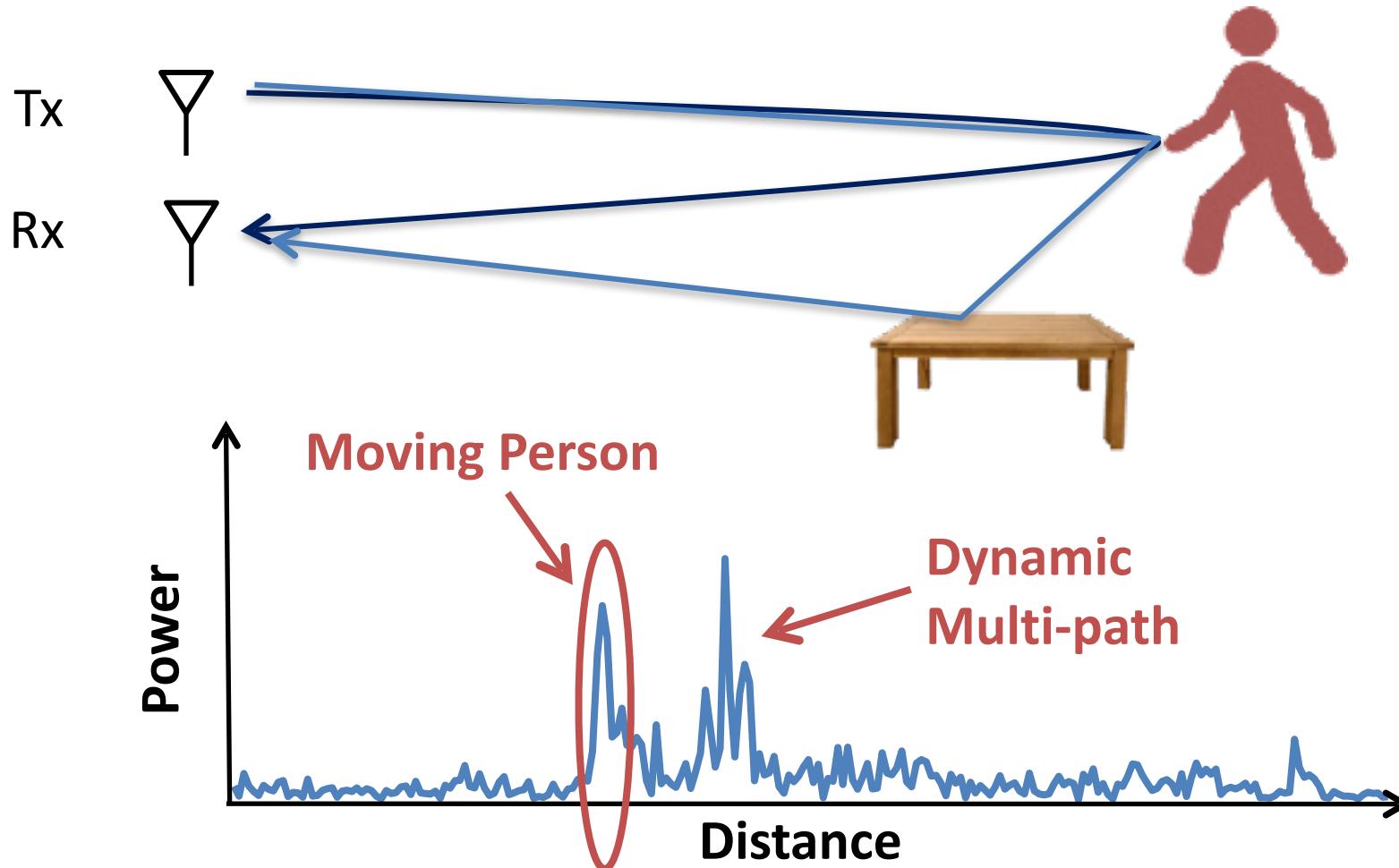
→ Eliminate by subtracting consecutive measurements



Why 2 peaks when we only have one moving person?

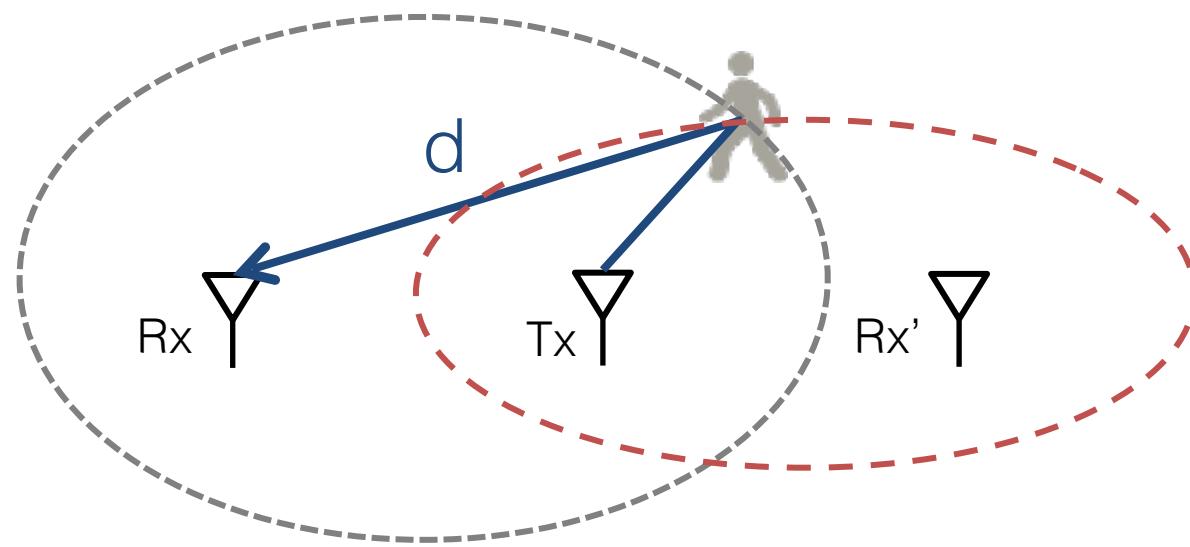


The direct reflection arrives before dynamic multipath!



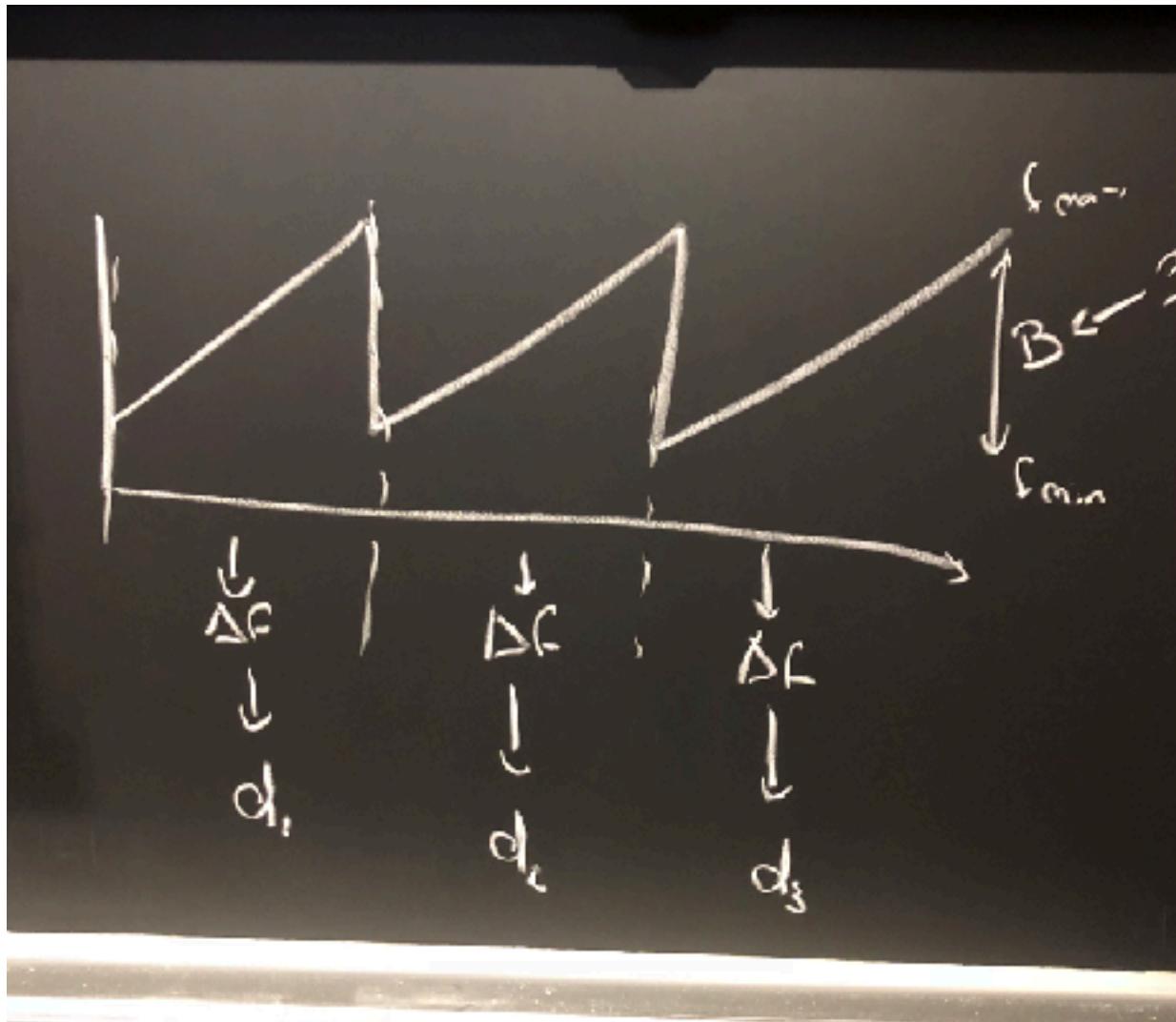
Mapping Distance to Location

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

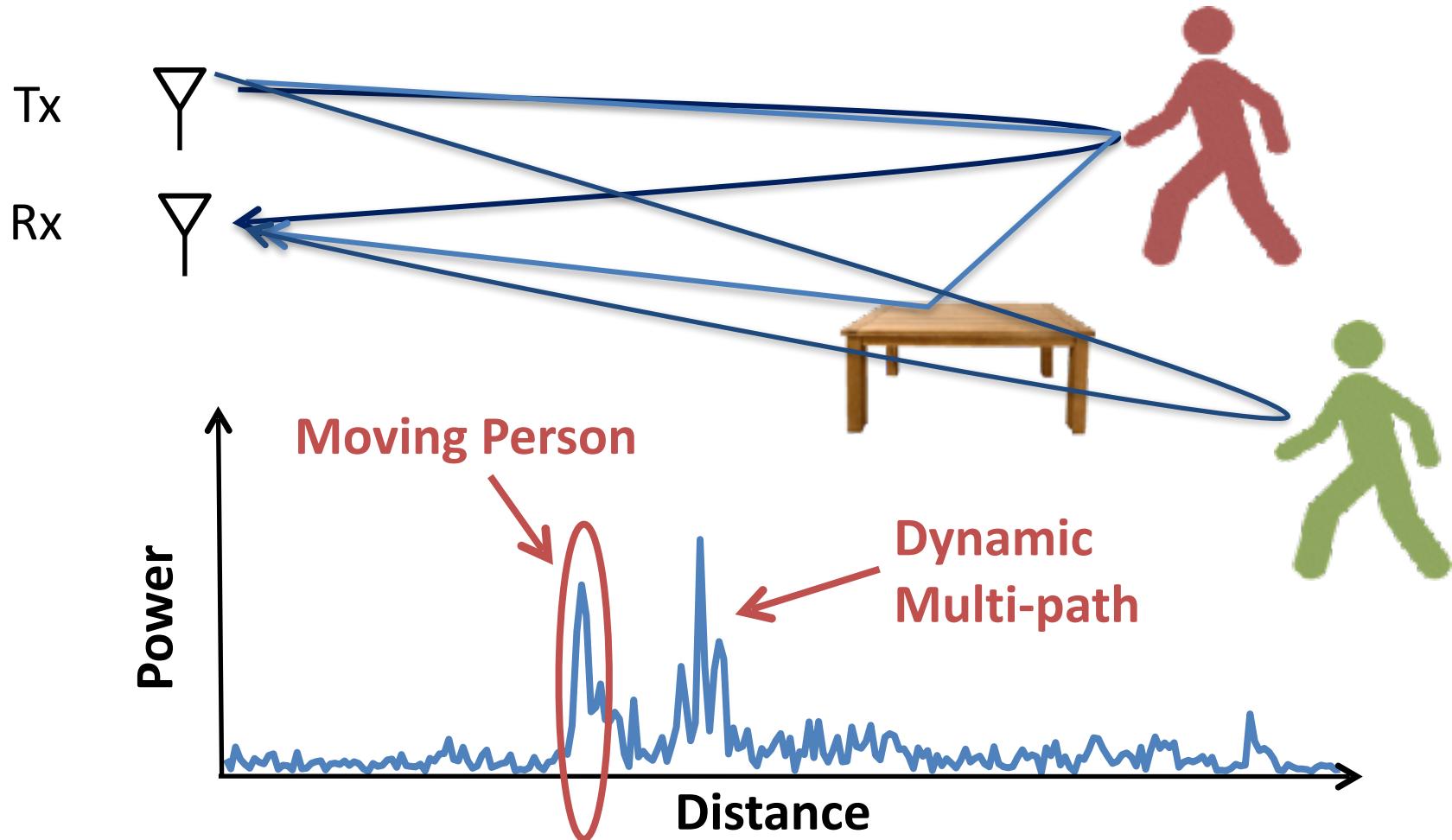


By adding another antenna and intersecting the ellipses, we can localize the person

From Location to tracking



Fails for multiple people in the environment, and we need a more comprehensive solution



How can we deal with multi-path
reflections when there are multiple
persons in the environment?

Idea: Person is consistent across different vantage points while multi-path is different from different vantage points

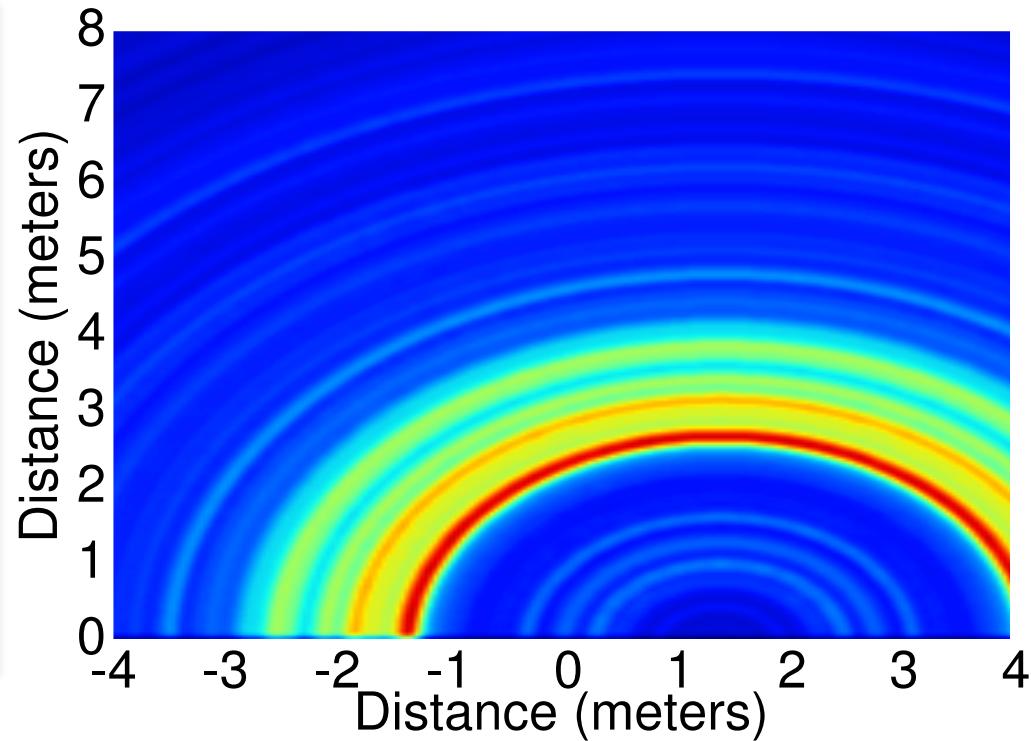
Combining across Multiple Vantage Points

Experiment: Two users walking

Setup



Single Vantage Point



Mathematically: each round-trip distance can be mapped to an ellipse whose foci are the transmitter and the receiver

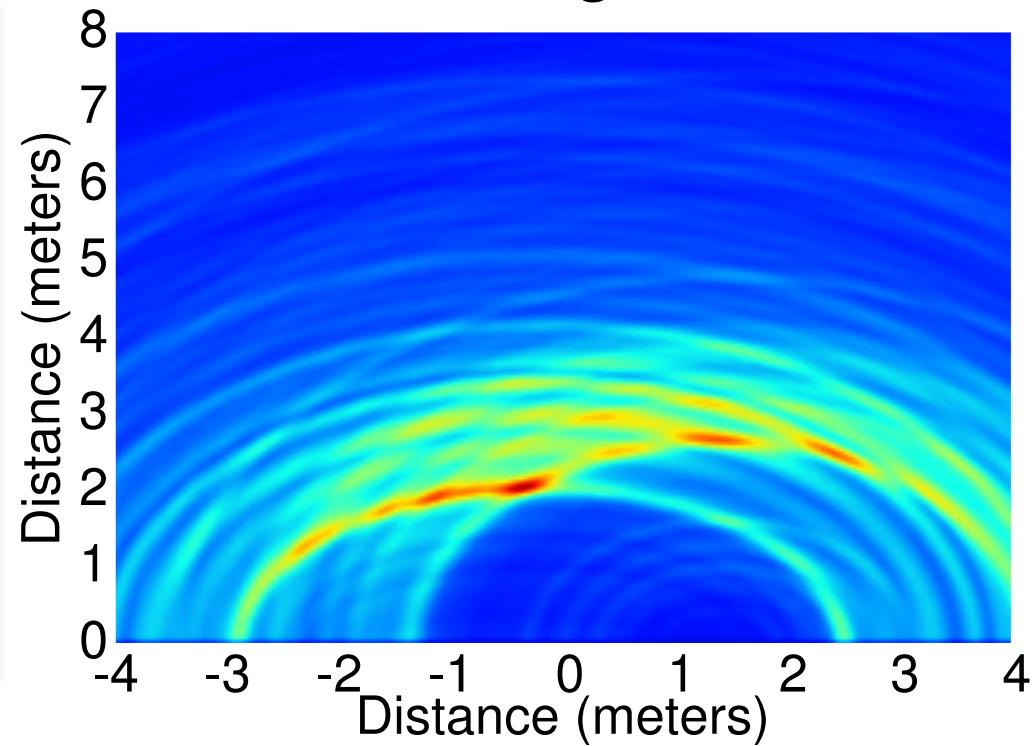
Combining across Multiple Vantage Points

Experiment: Two users walking

Setup



Two Vantage Points



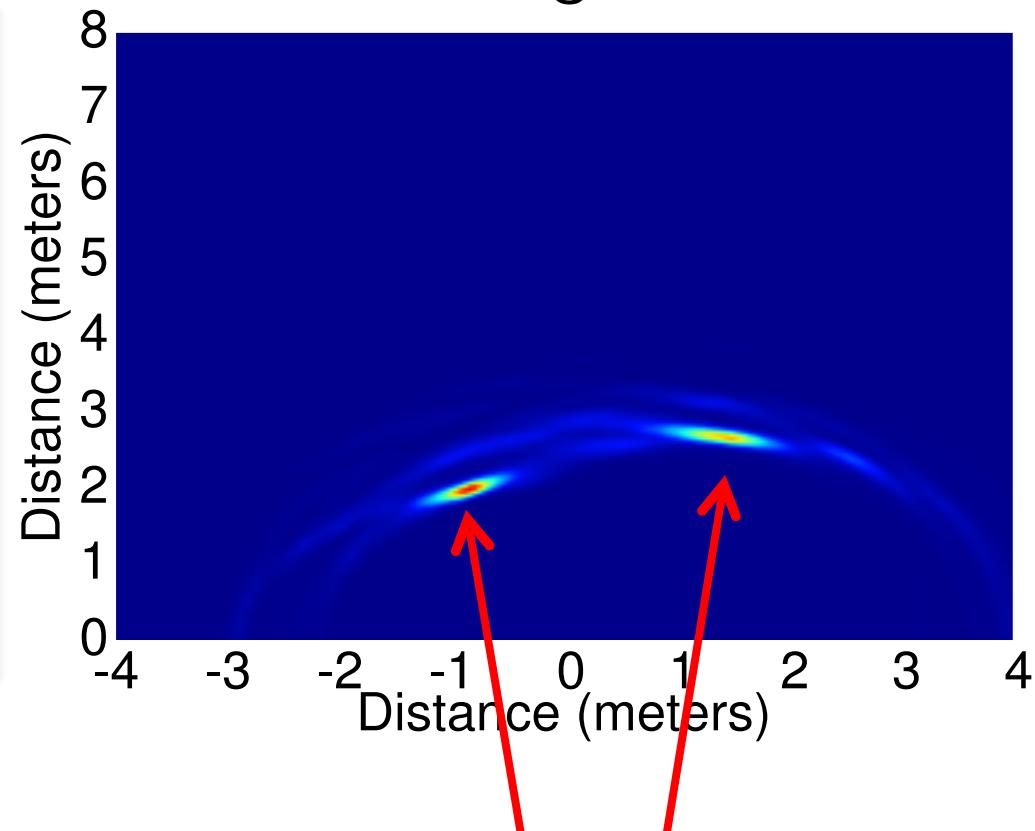
Combining across Multiple Vantage Points

Experiment: Two users walking

Setup



16 Vantage Points

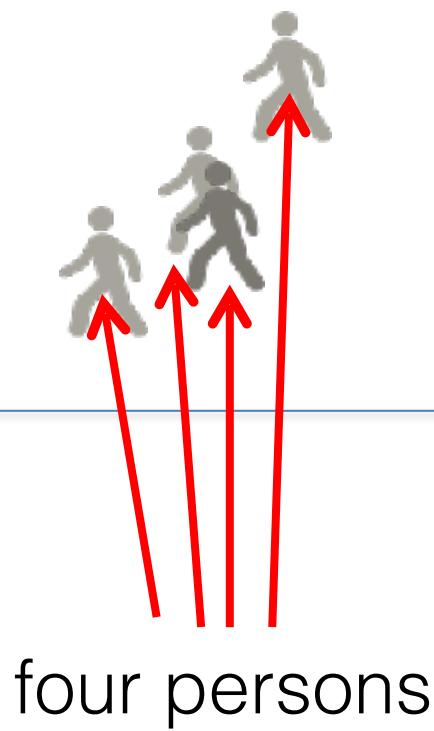


Localize the two users

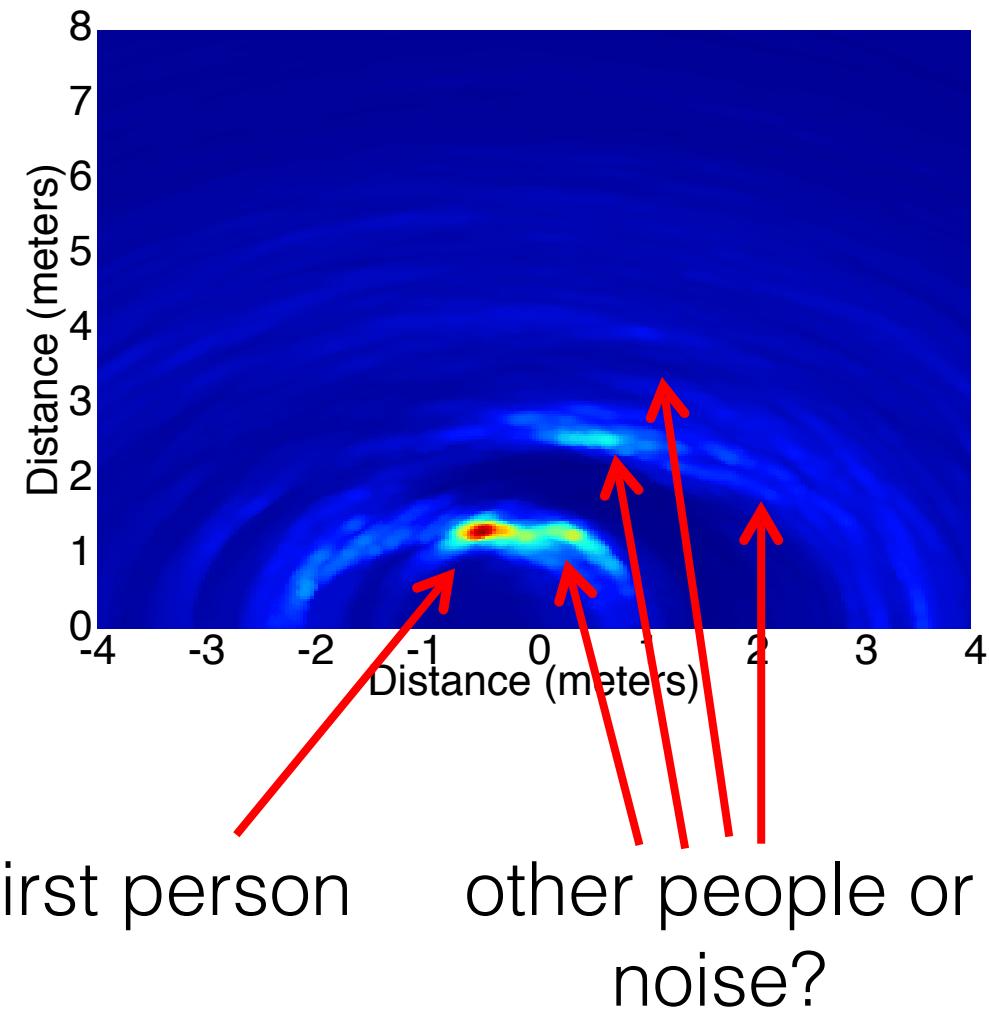
Multi-User Localization

Experiment: Four persons walking

Setup

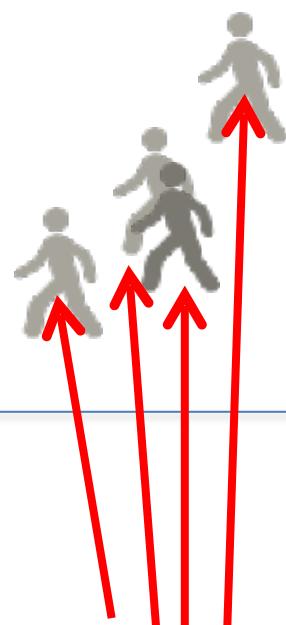


All Vantage Points



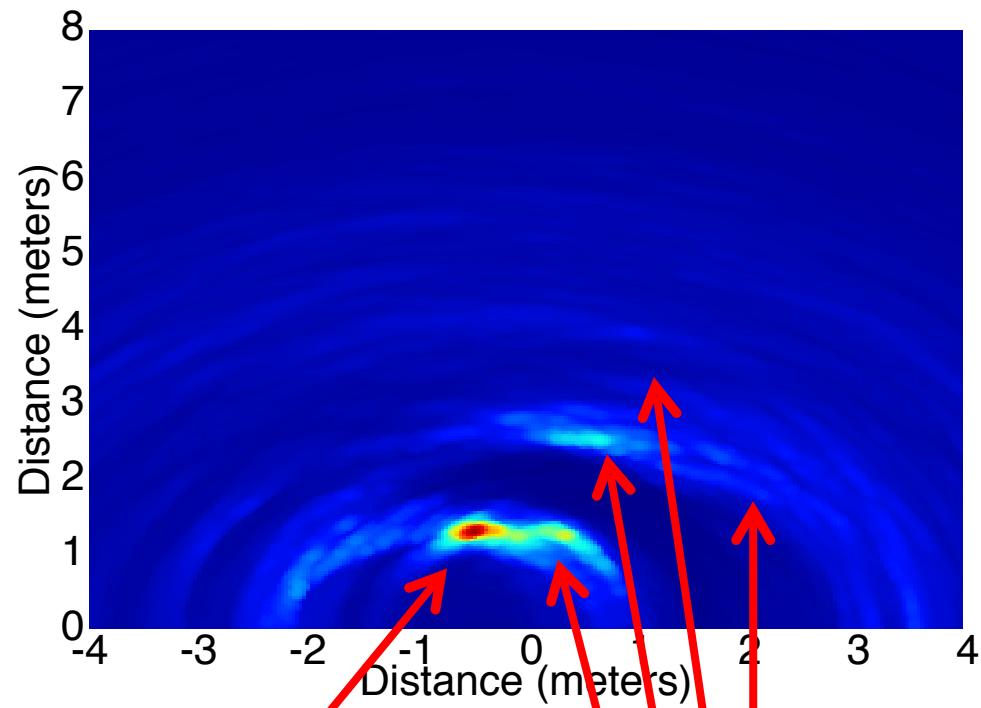
Near-Far Problem: Nearby persons have more power than distance reflectors and can mask them

Setup



four persons

All Vantage Points



first person

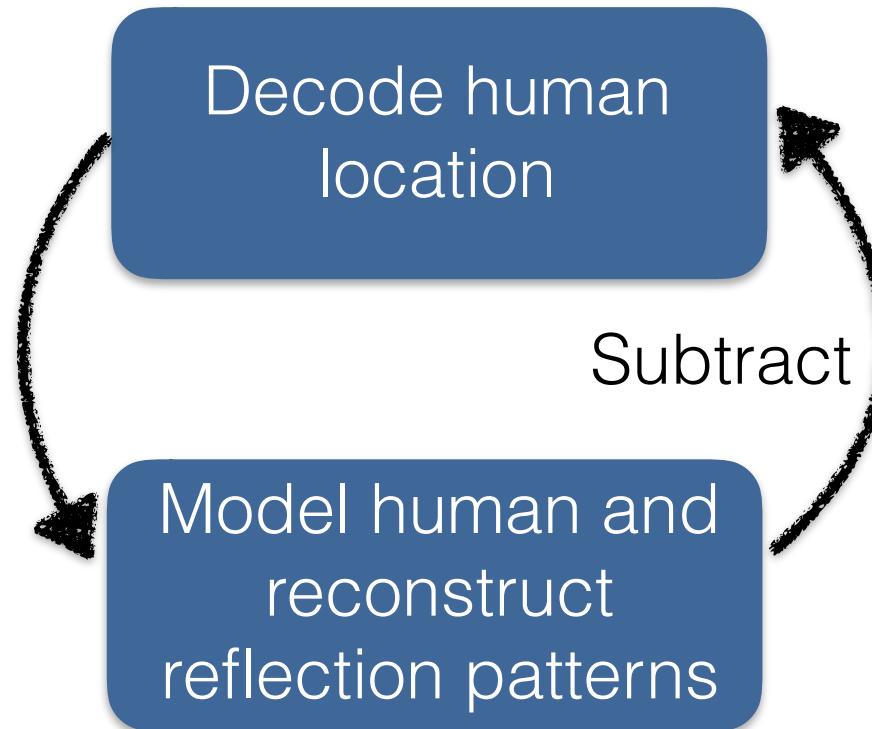
other people or
noise?

Successive Silhouette Cancellation:
a new algorithm that localizes multiple
persons in the scene by addressing the
near-far problem

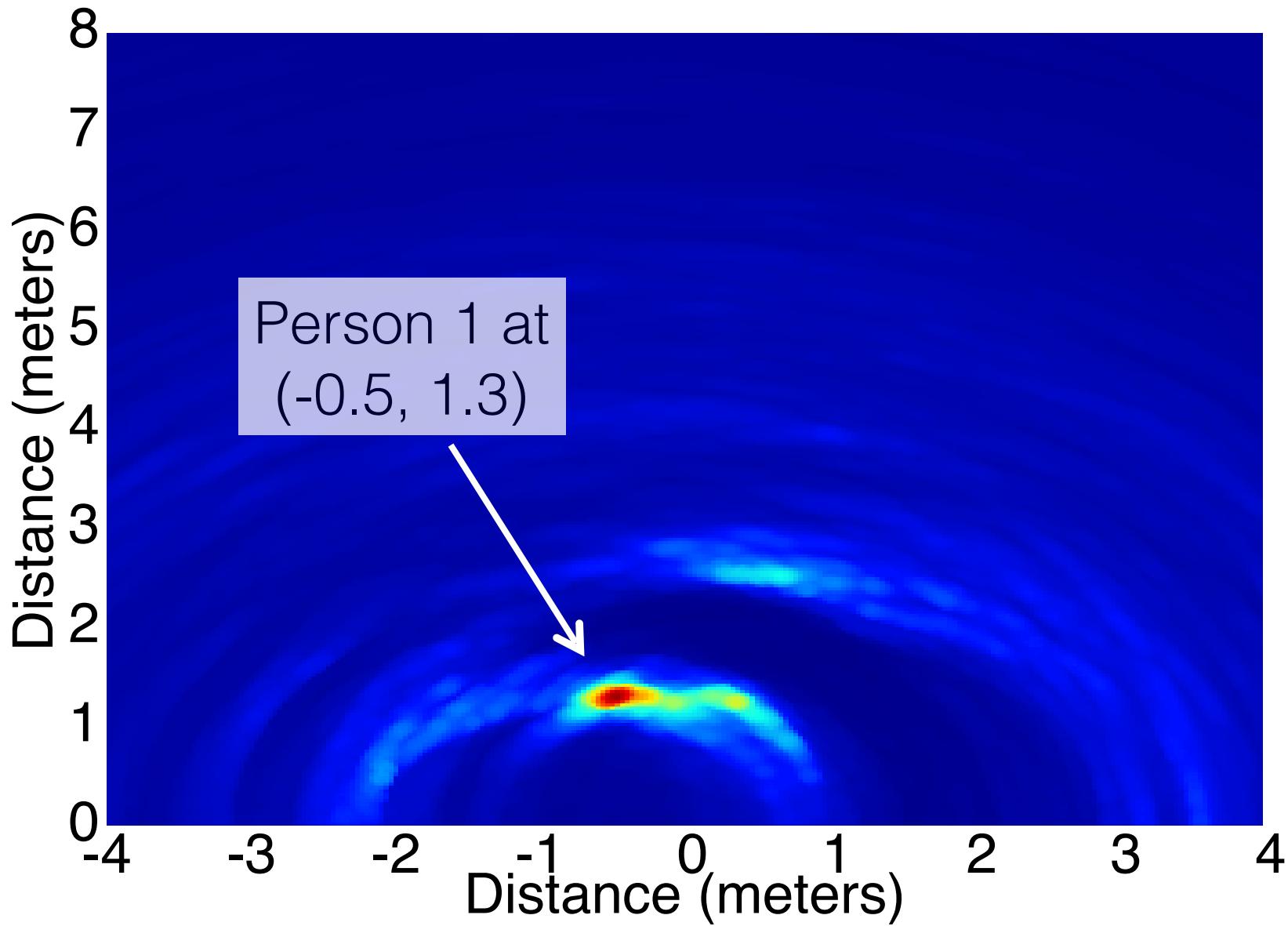
Successive Silhouette Cancellation:

a new algorithm that localizes multiple persons in the scene by addressing the near-far problem

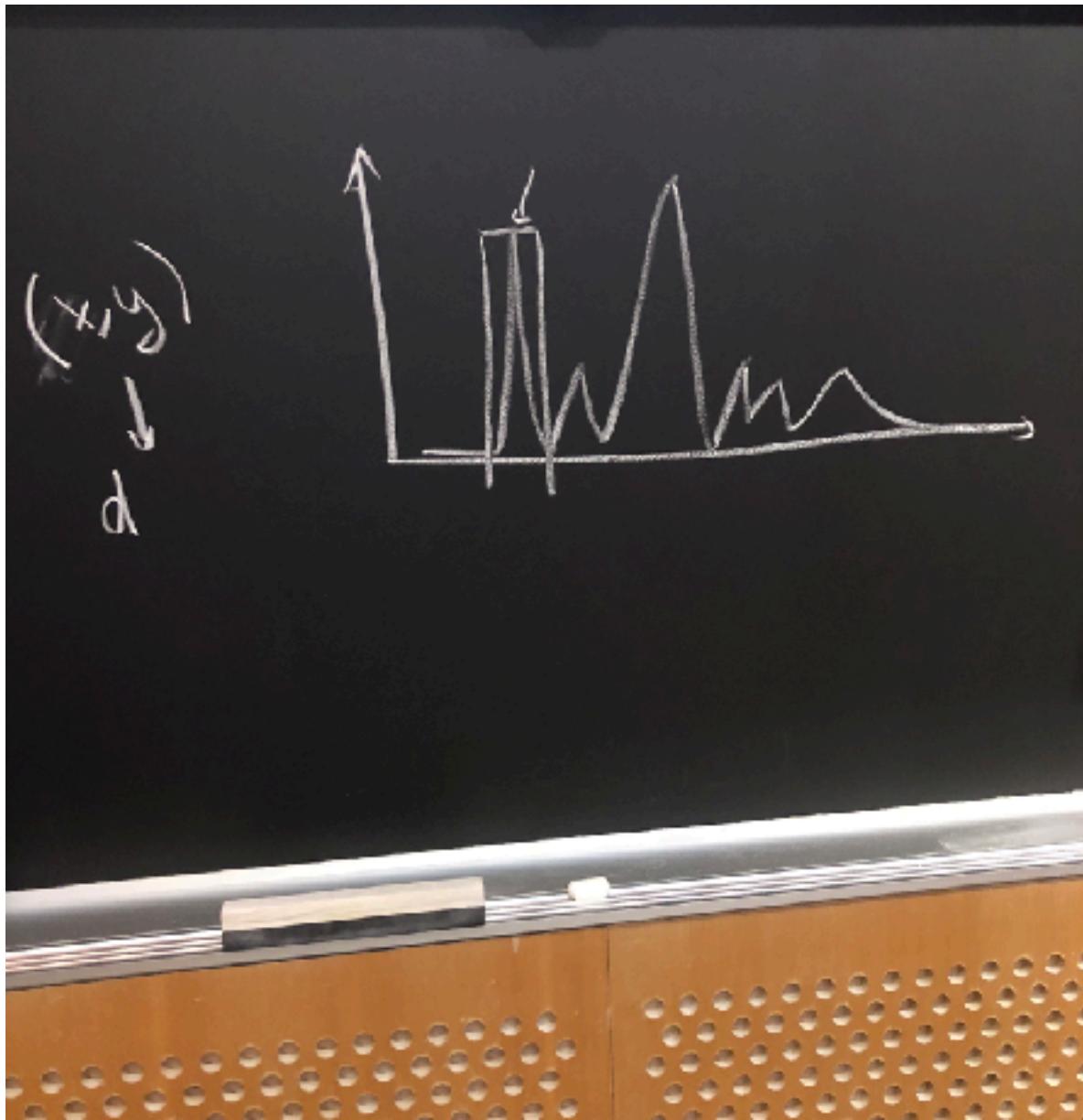
Goal: Recover human reflections



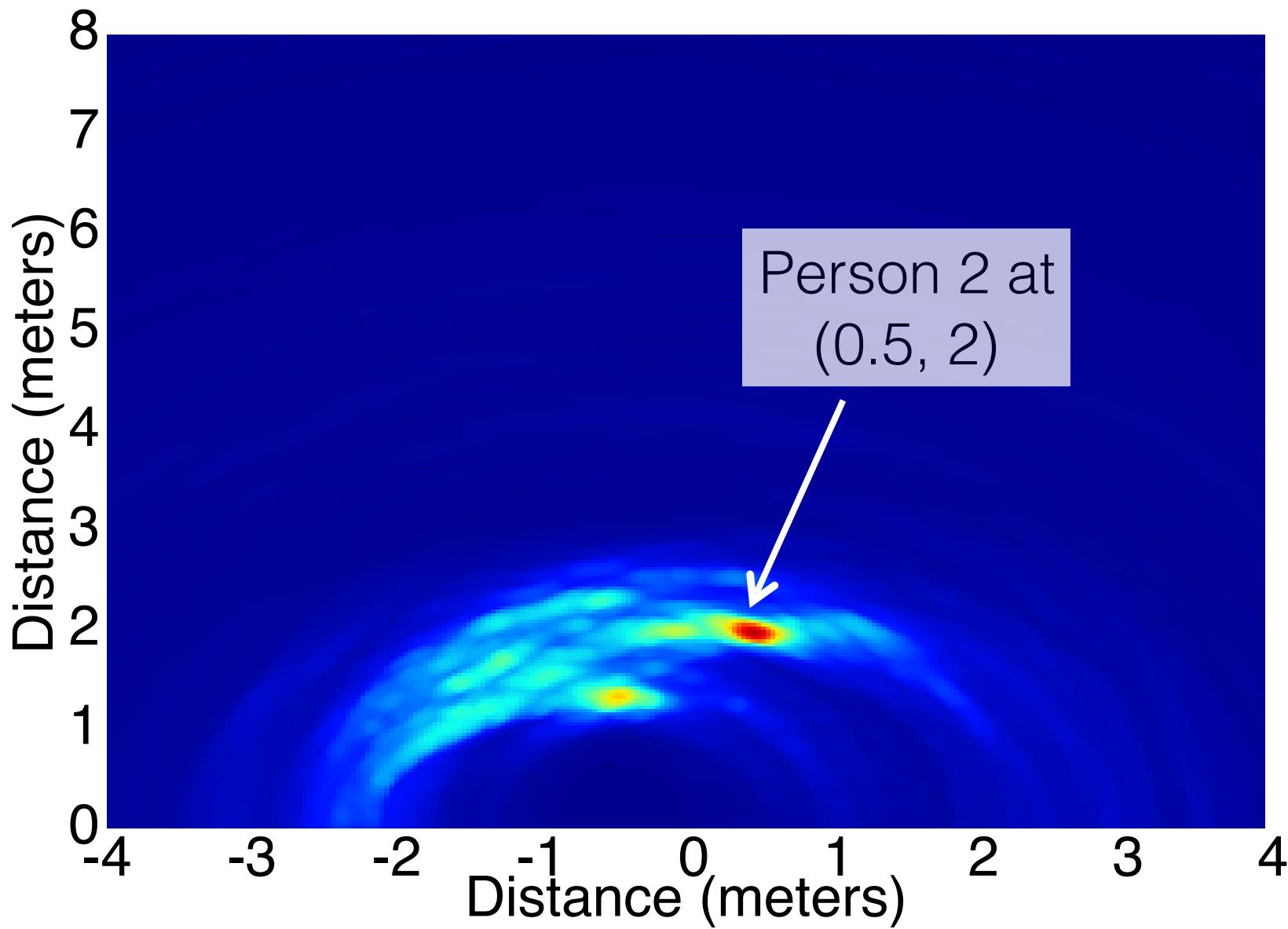
First localize the user with the strongest reflection



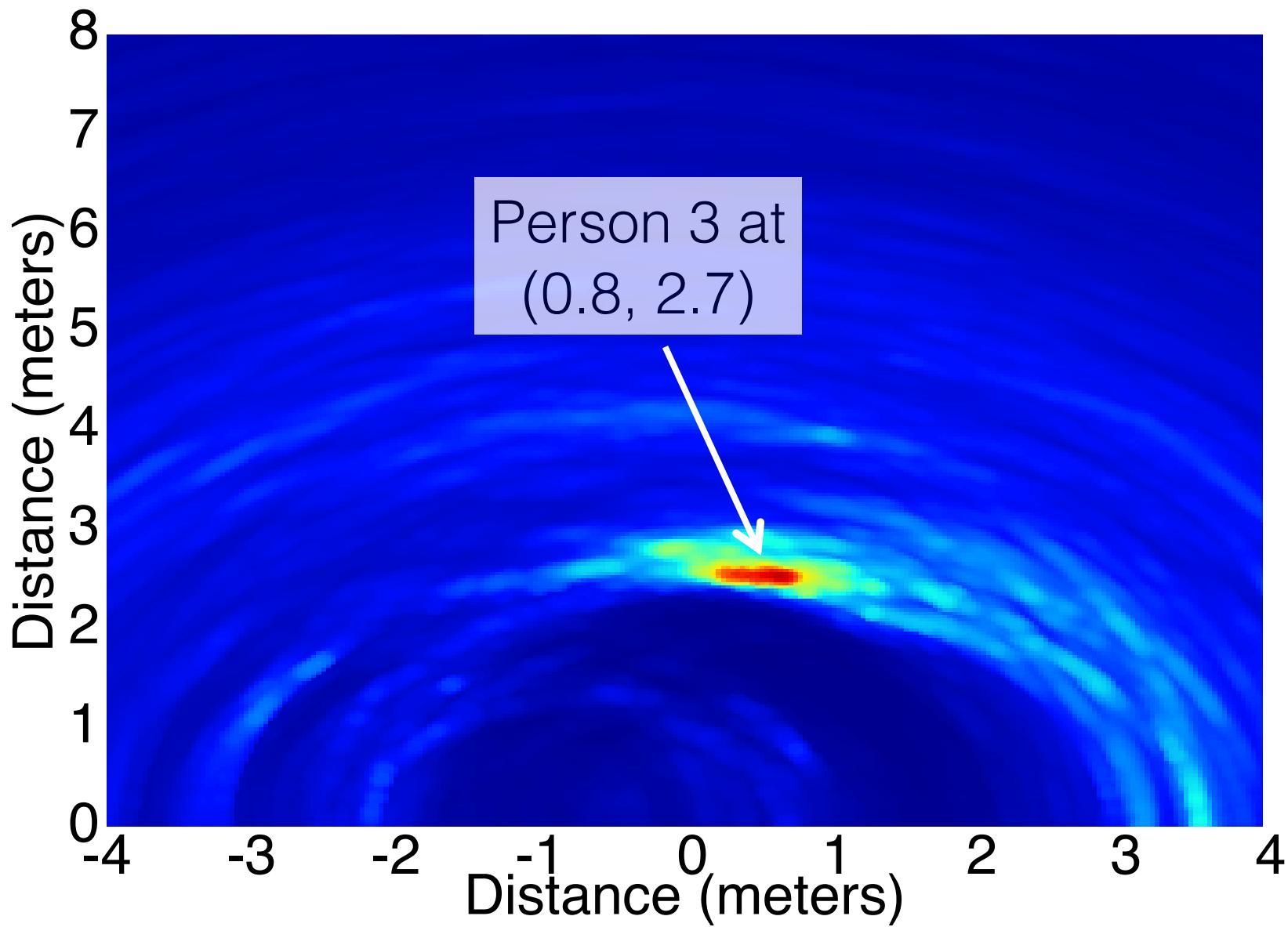
Cancel the impact of the person's whole body



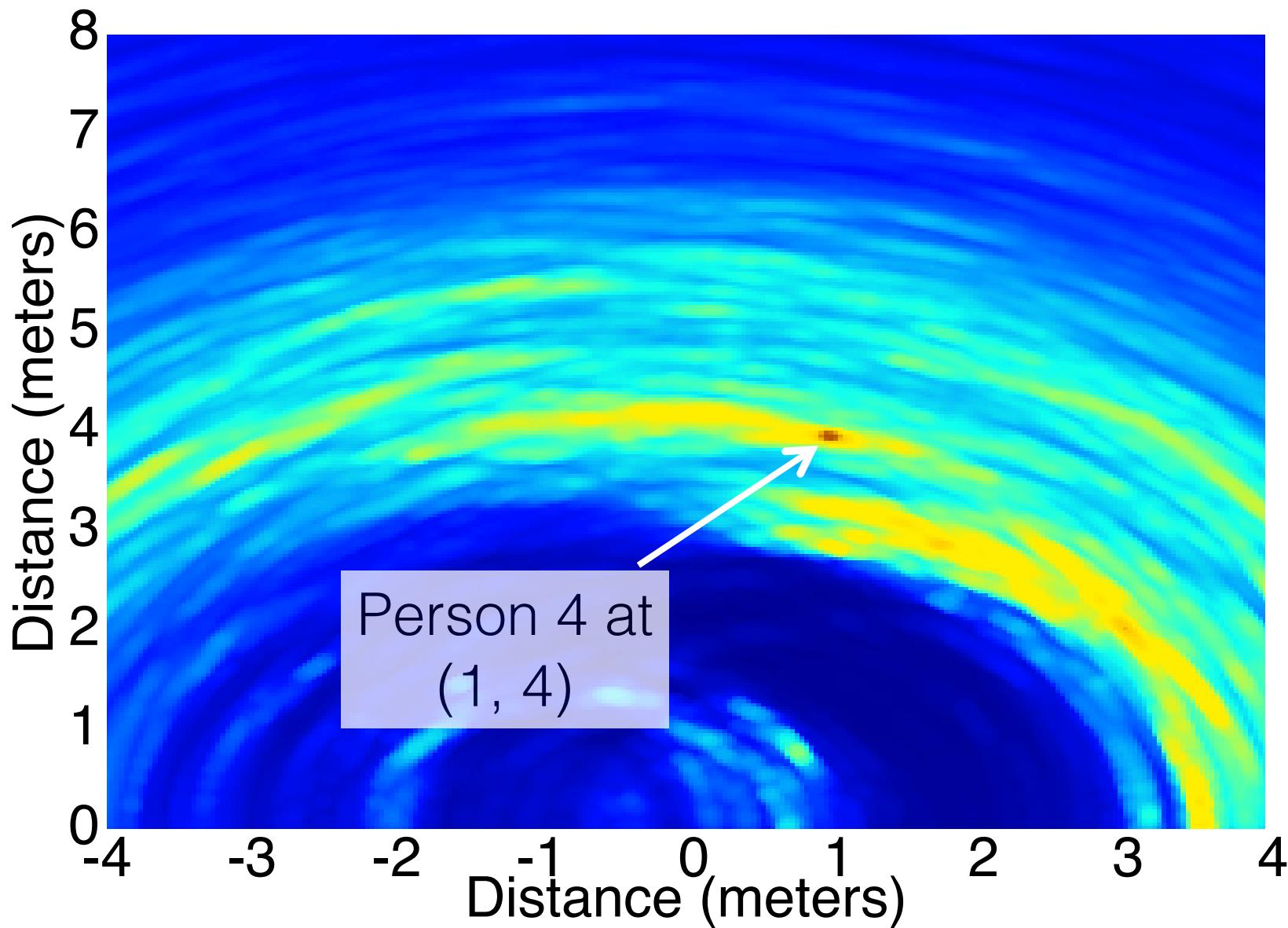
After reconstructing and cancelling the first user's reflections



Iteratively localize the remaining users in the scene

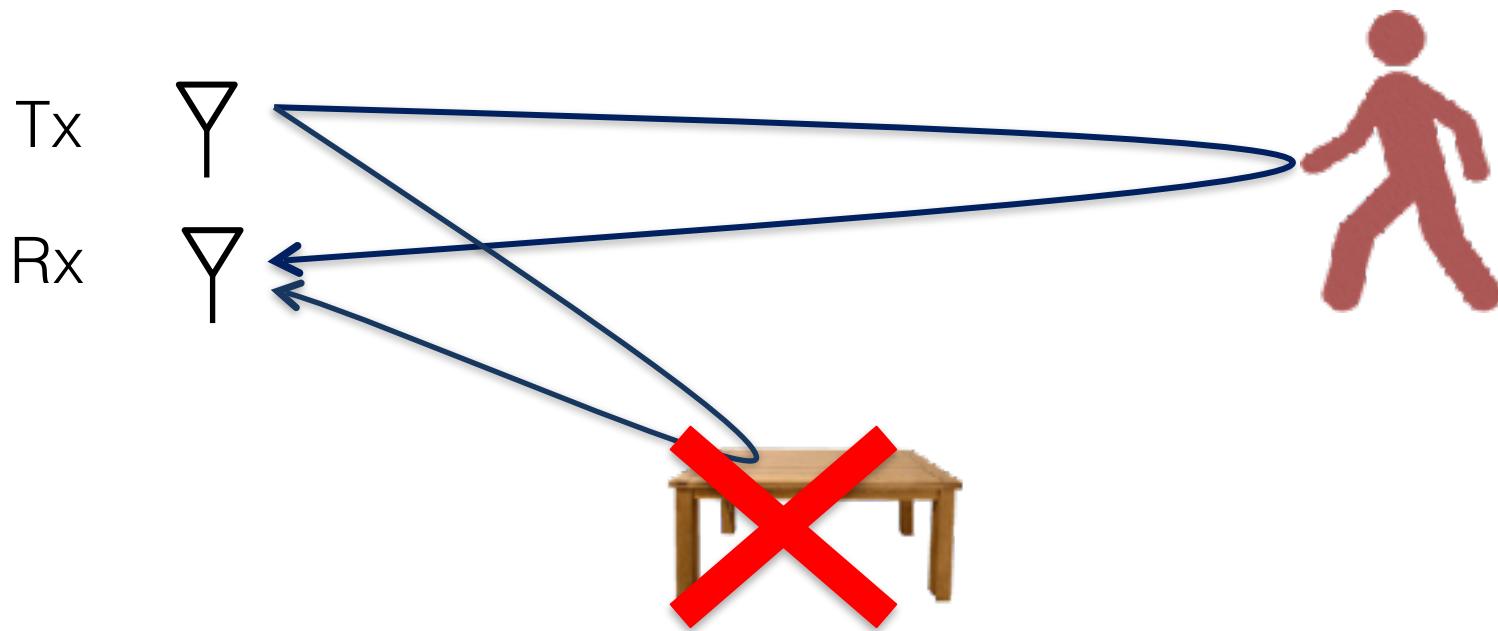


Iteratively localize the remaining users in the scene



How can we localize static users?

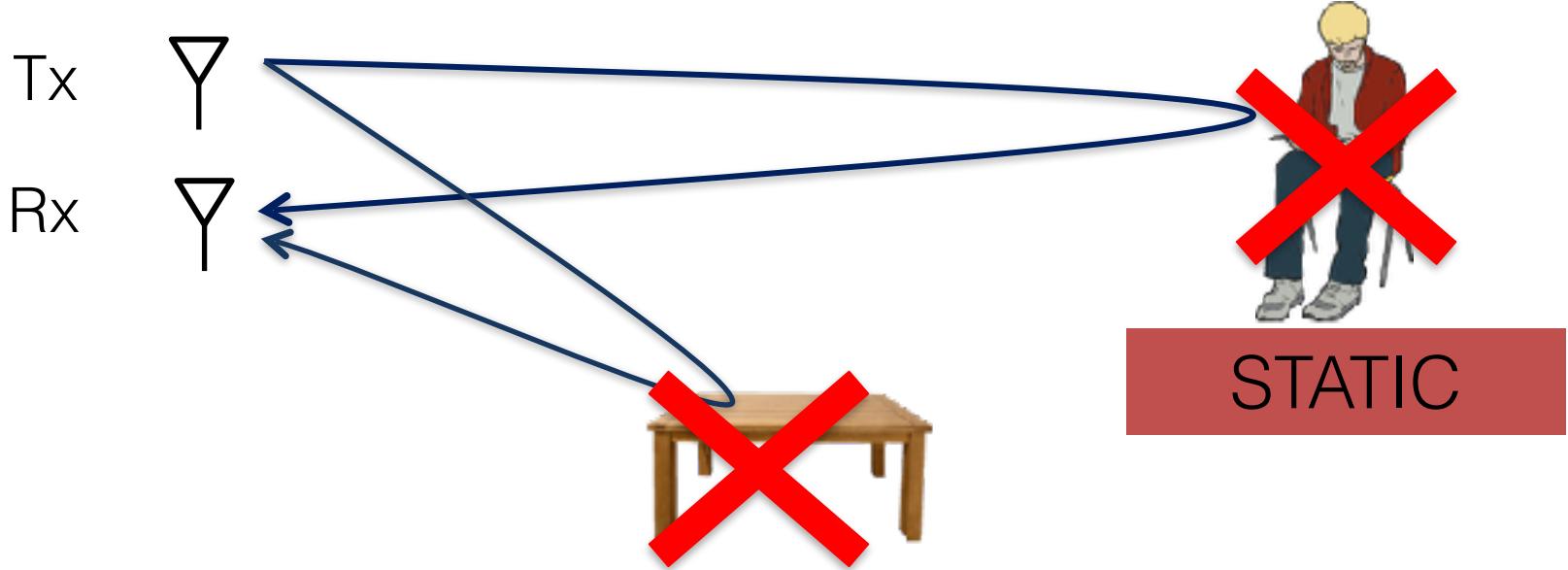
Dealing with multi-path when there is one moving user



We eliminated direct table reflections by subtracting consecutive measurements

Needs User to Move

Dealing with multi-path when there is one moving user



We eliminated direct table reflections by subtracting consecutive measurements

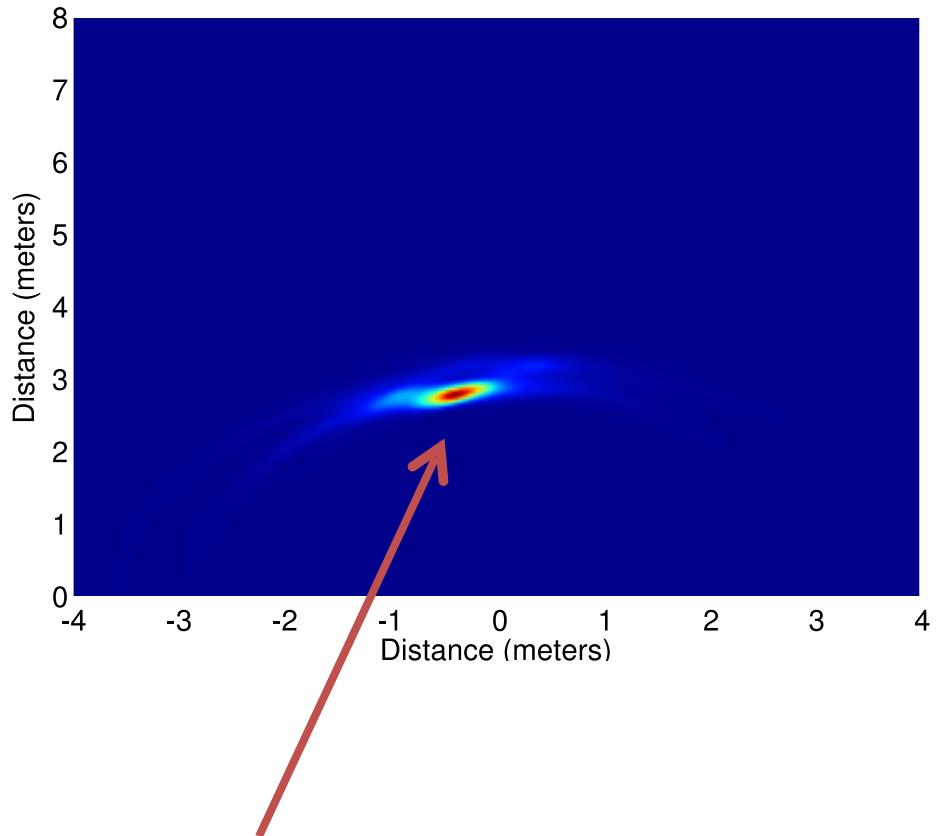
Needs User to Move

Exploit breathing motion for localize static users

- Breathing and walking happen at different time scales
 - A user that is pacing moves at 1m/s
 - When you breathe, chest moves by few mm/s
- Cannot use the same subtraction window to eliminate multi-path

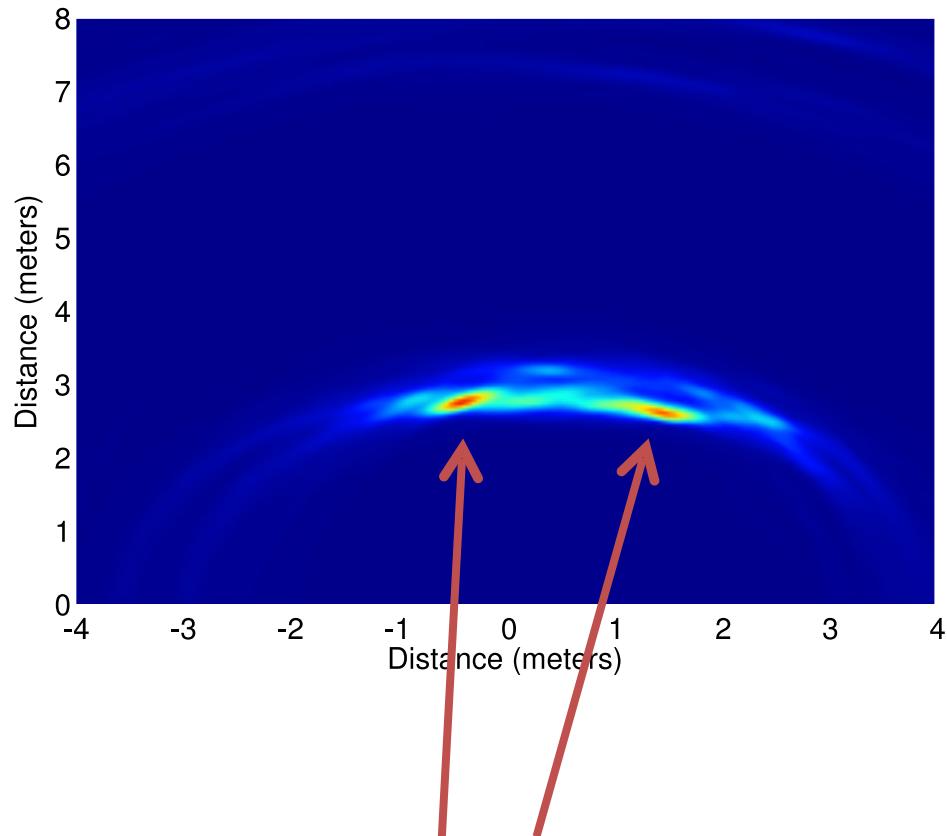
User Walking at 1m/s

30ms subtraction window



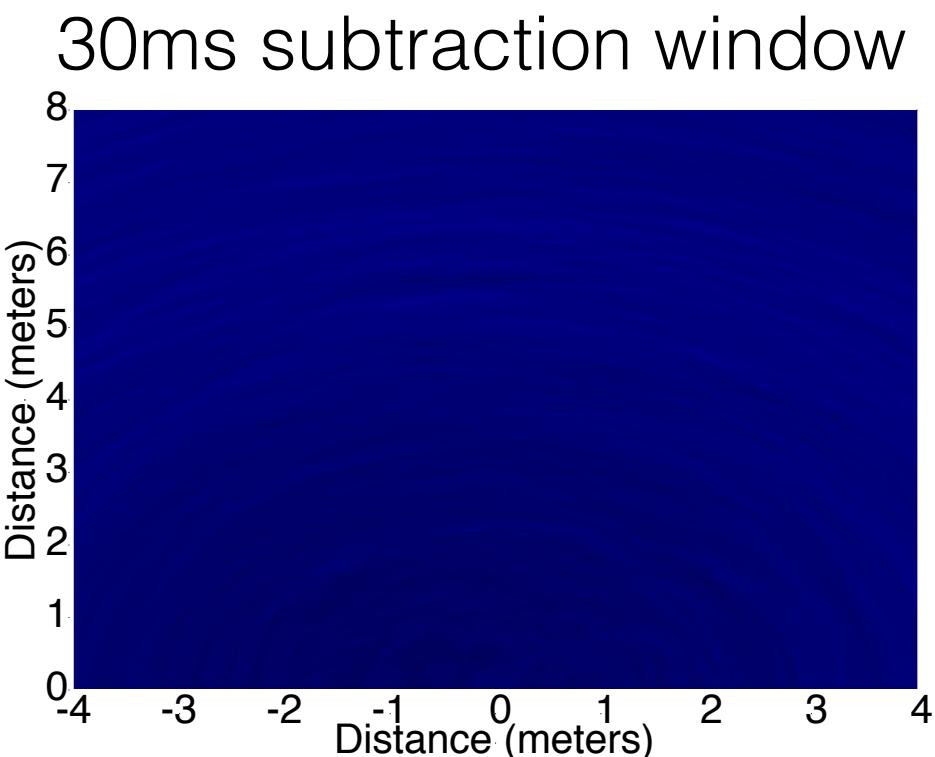
Localize the person

3s subtraction window

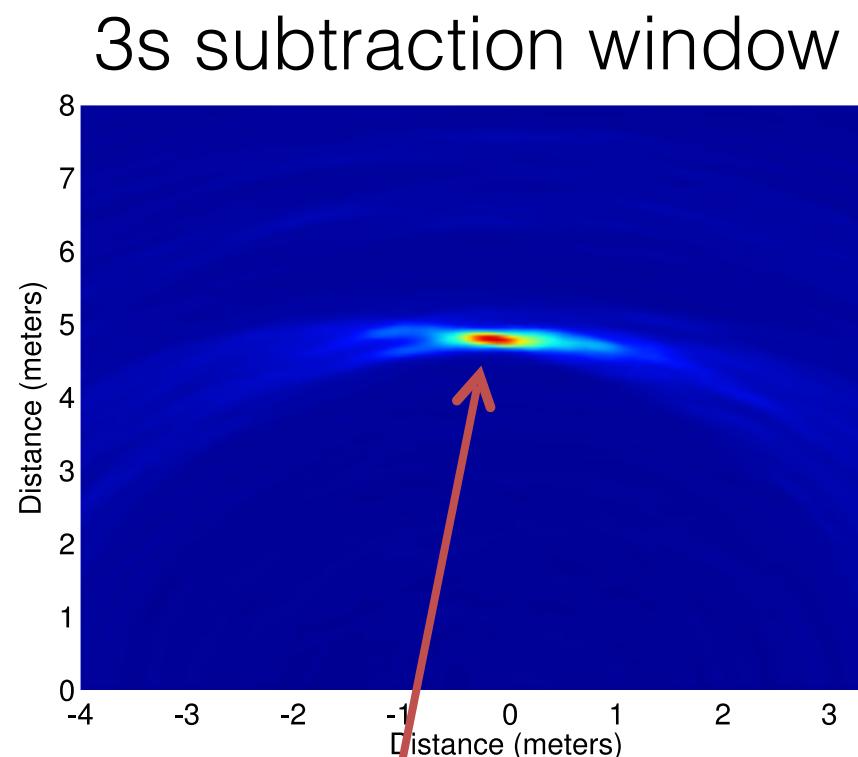


Person appears in two locations

User Sitting Still (Breathing)



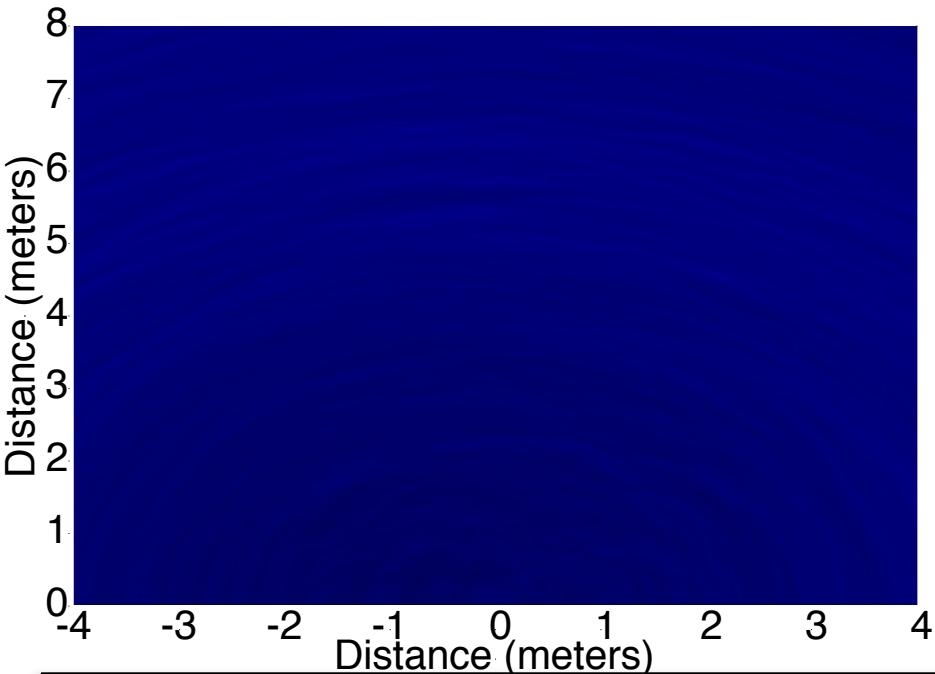
Cannot localize



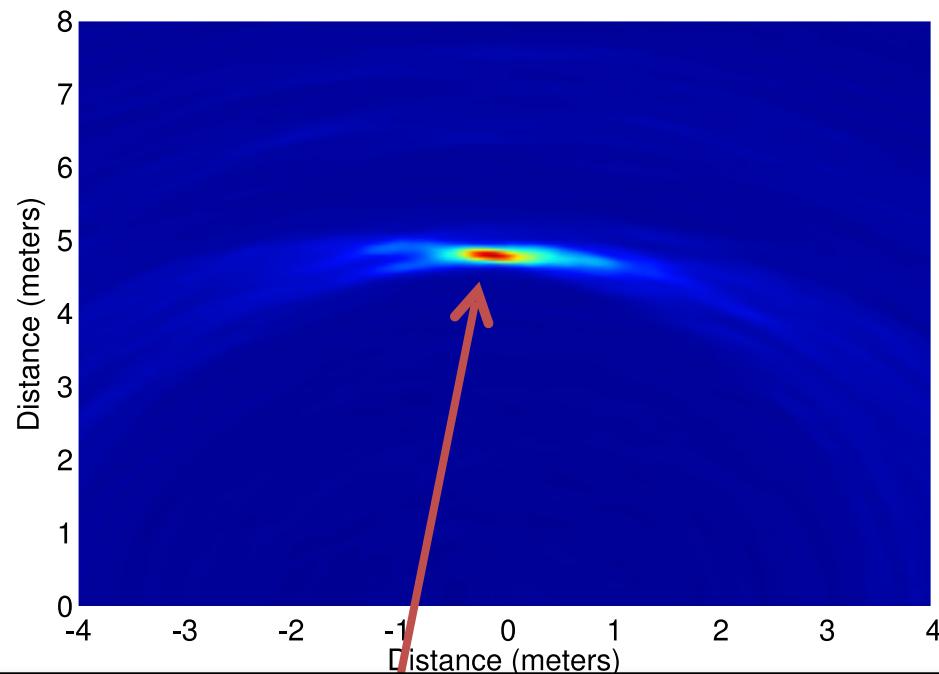
Localize the
person

User Sitting Still (Breathing)

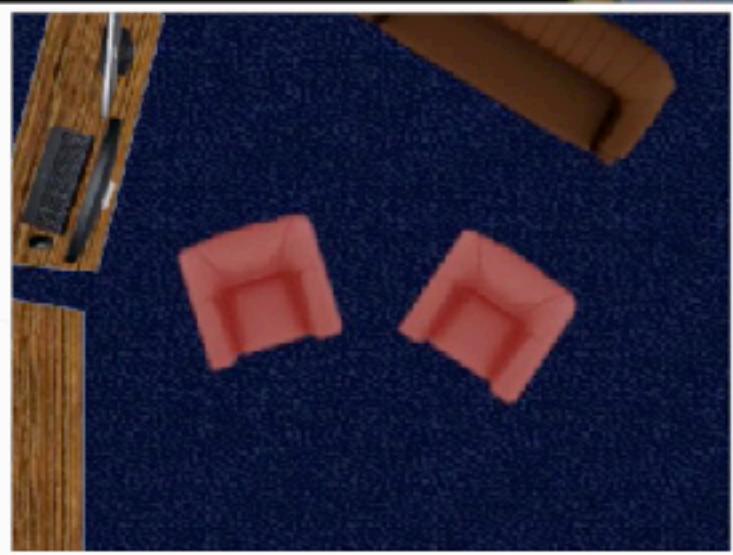
30ms subtraction window



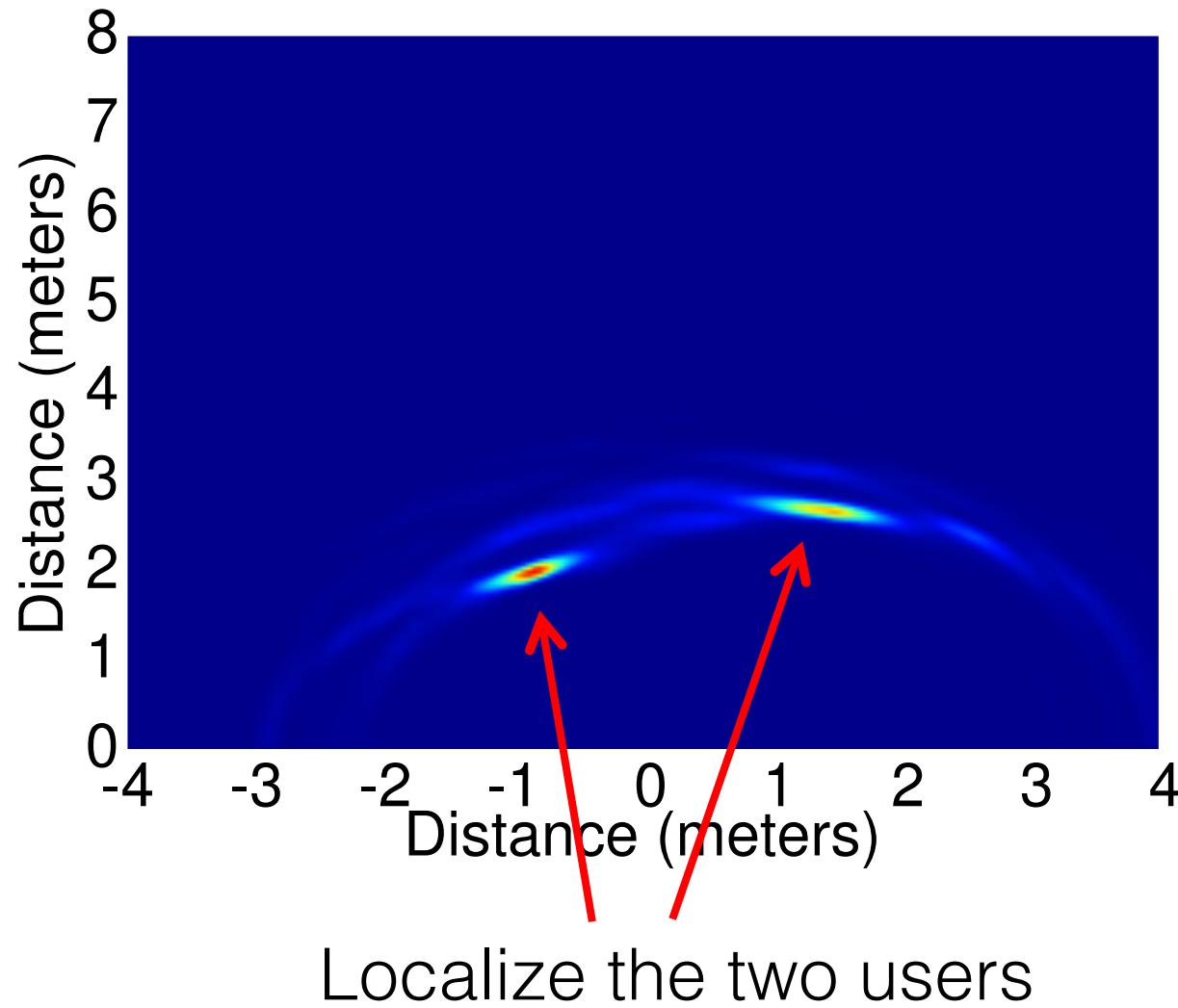
3s subtraction window



Use multi-resolution subtraction window to
eliminate multi-path while being able to localize
both static and moving users

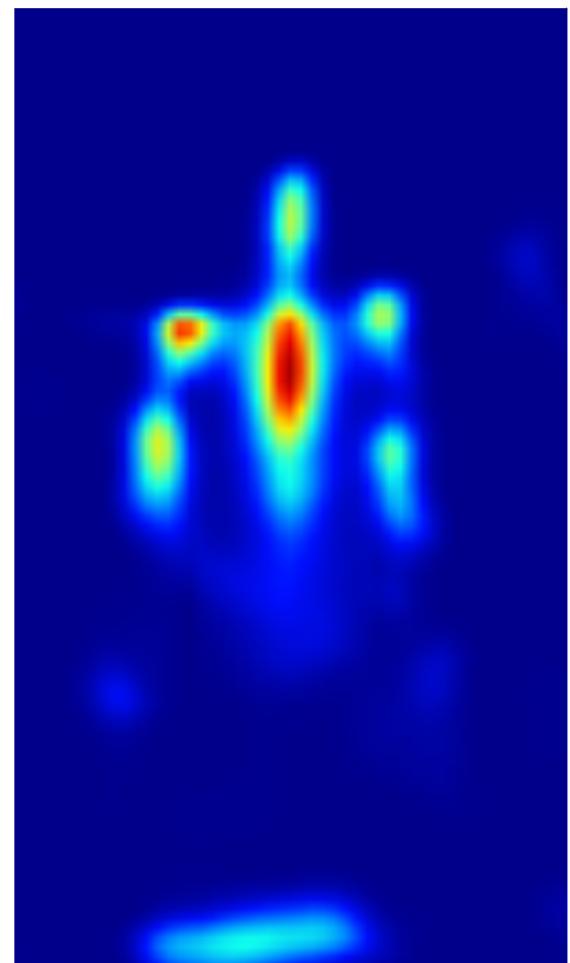
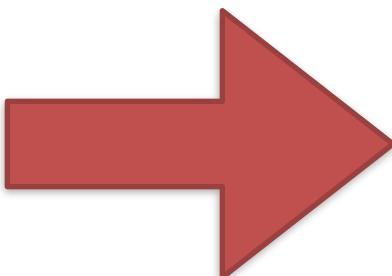
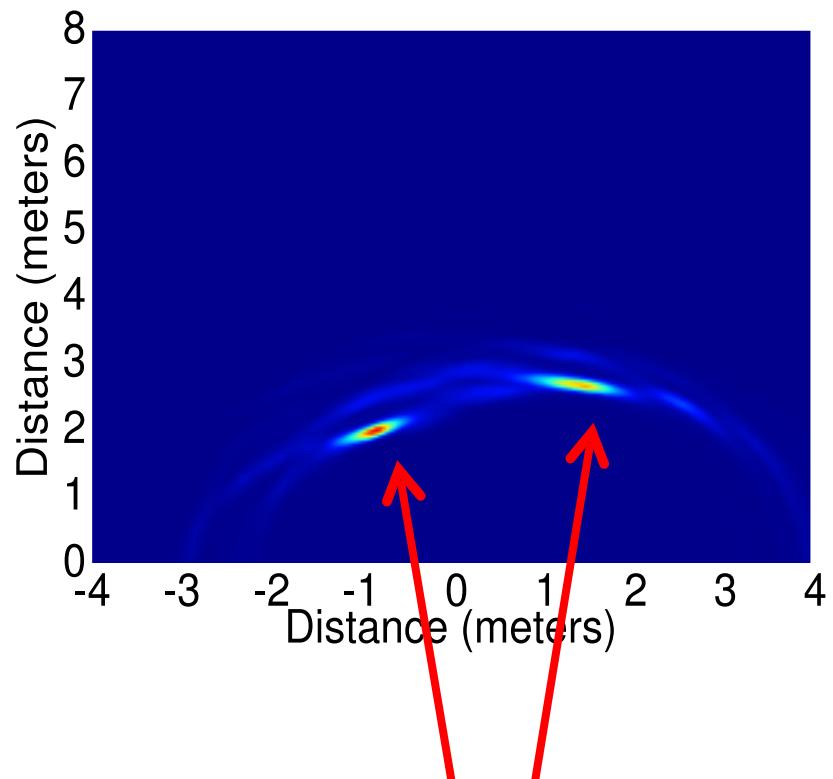


Centimeter-scale localization without requiring the user to carry a wireless device



Want a silhouette

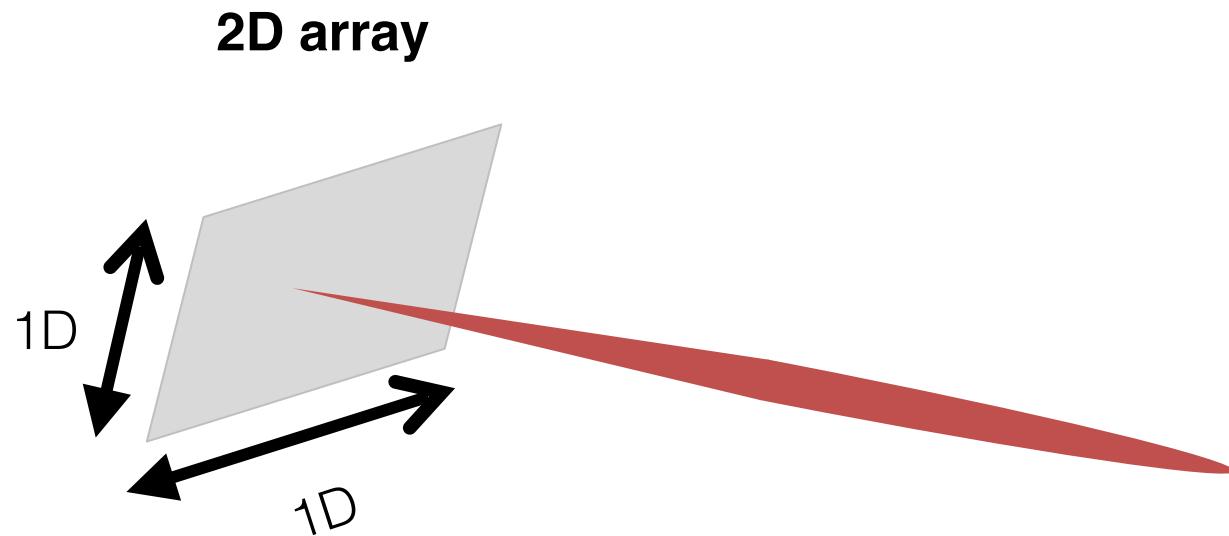
People are points



Localize the two users

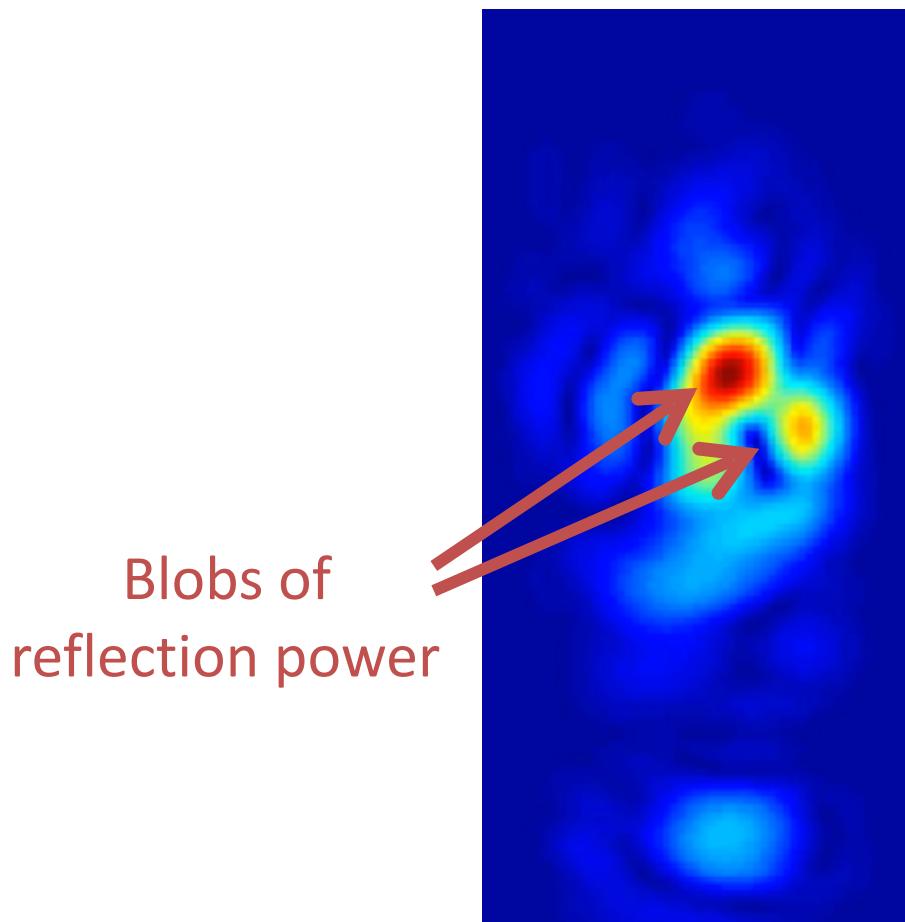
Approach: Combine antenna arrays with FMCW to get 3D image

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

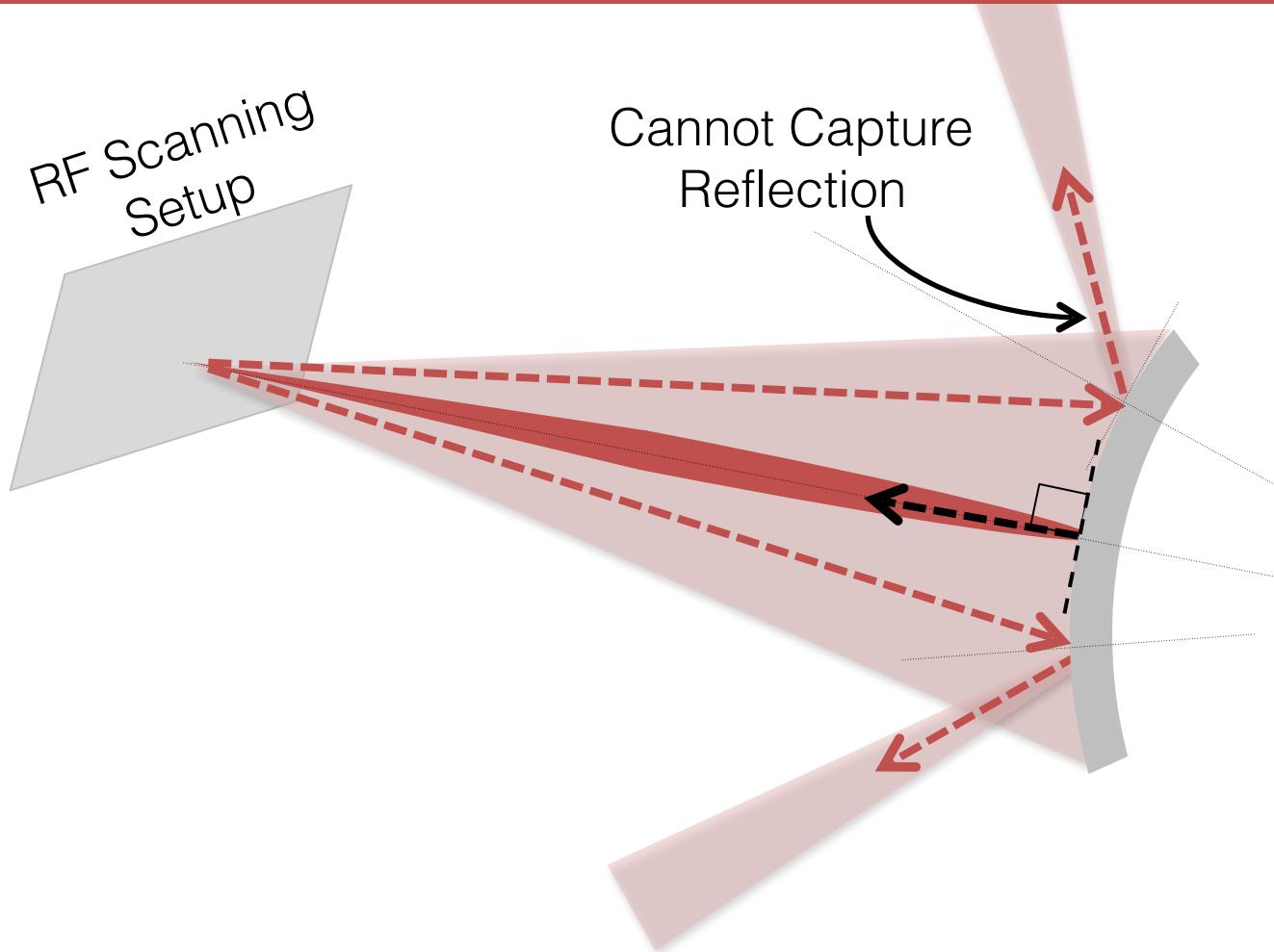


Challenge: We only obtain blobs in space

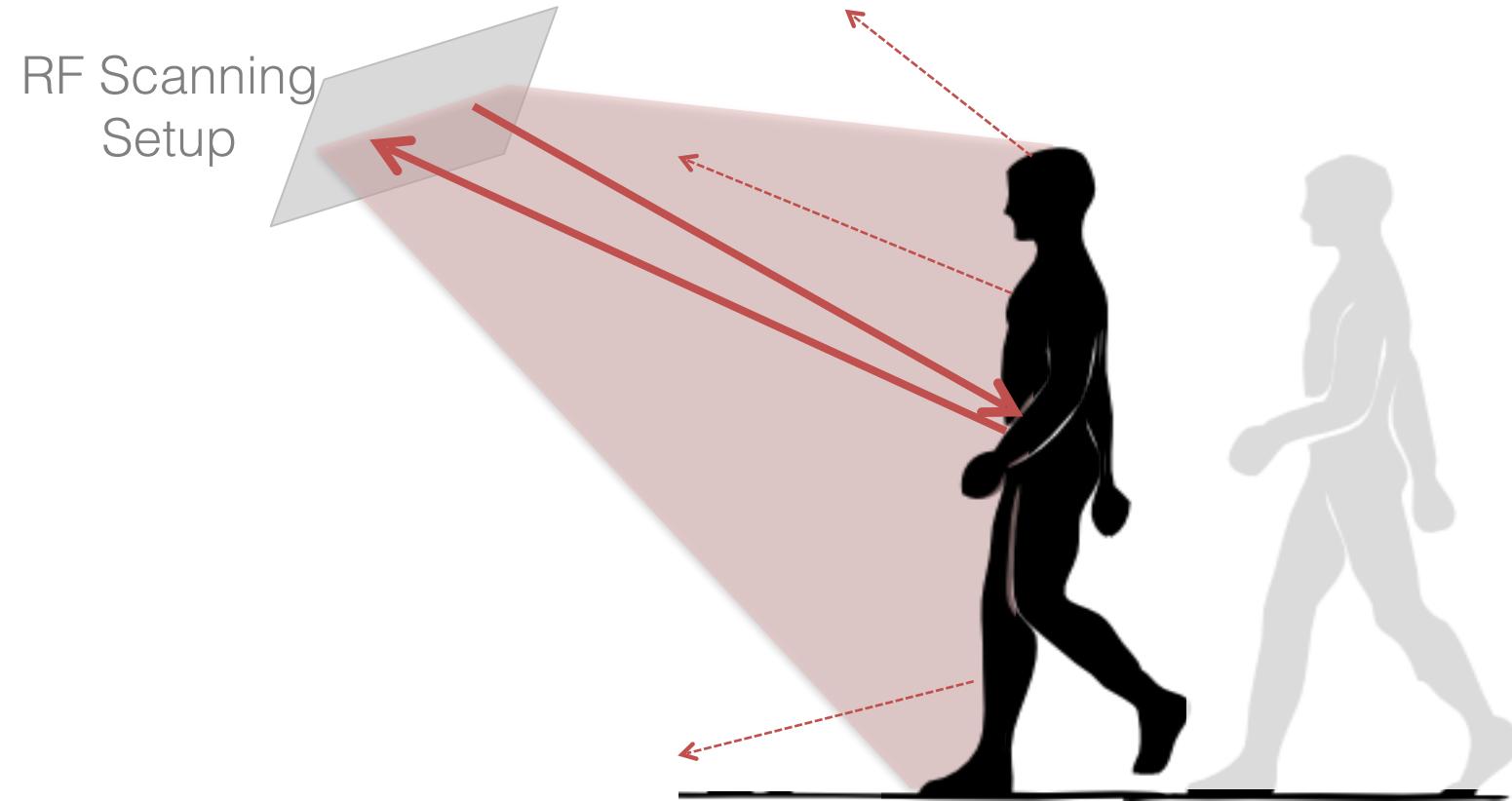
Output of 3D RF Scan



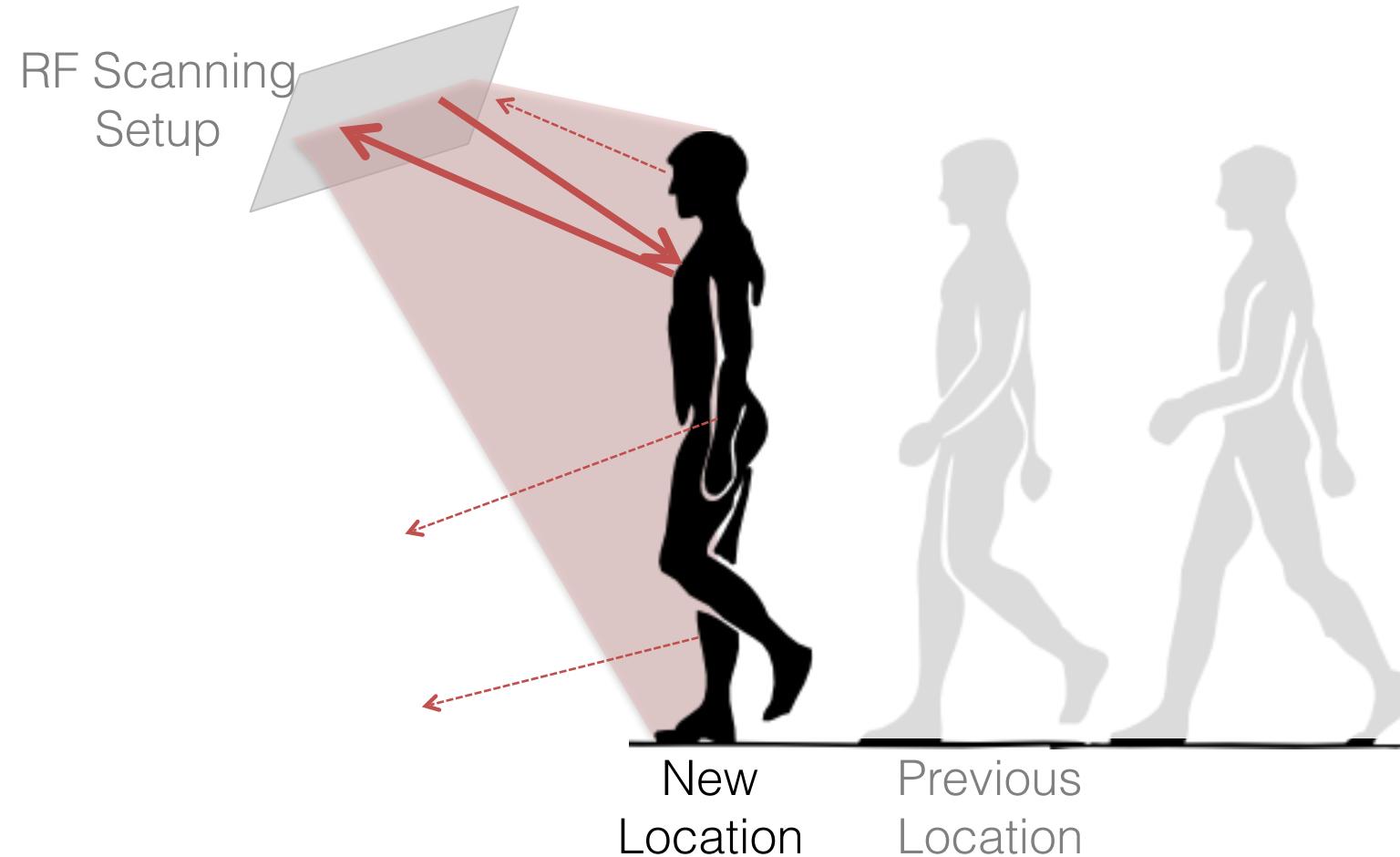
At every point in time, we get reflections from only a subset of body parts.



Solution Idea: Exploit Human Motion and Aggregate over Time



Solution Idea: Exploit Human Motion and Aggregate over Time



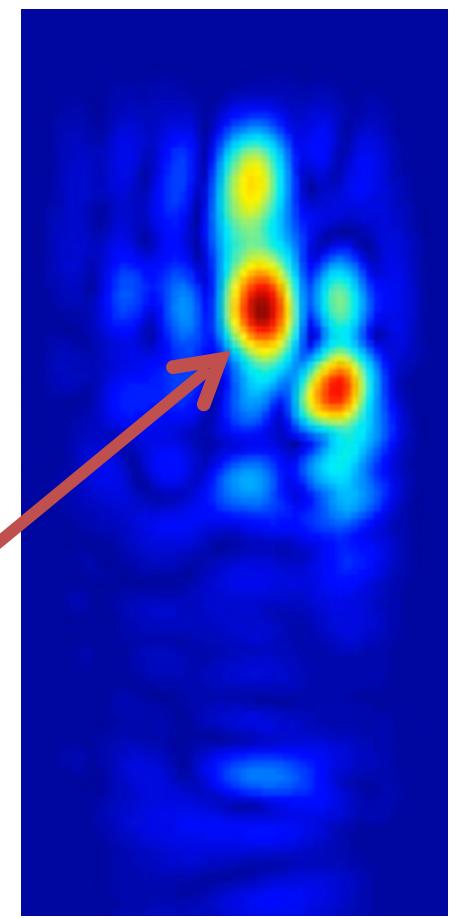
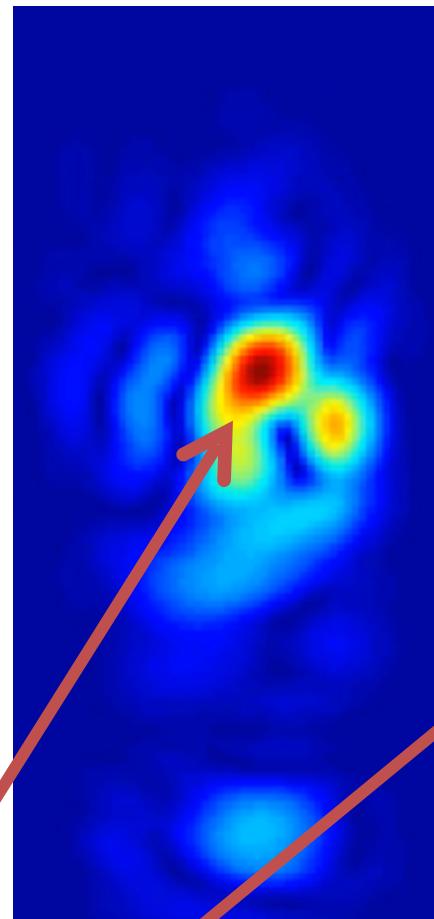
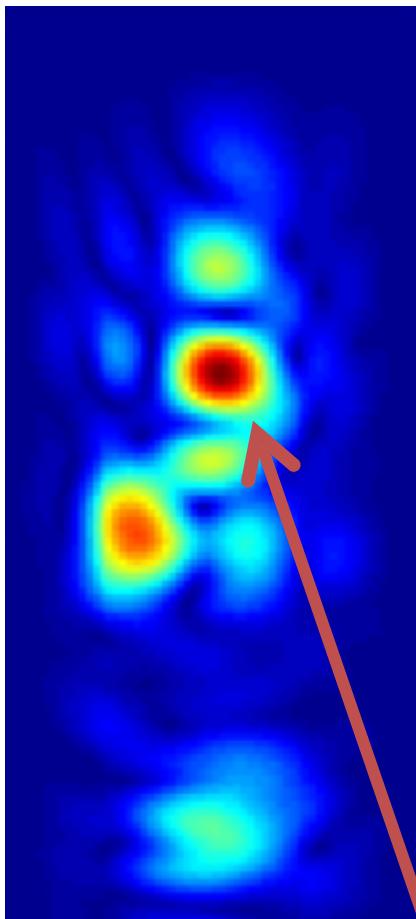
Combine the various snapshots

Human Walks toward Sensor

3m

2.5m

2m



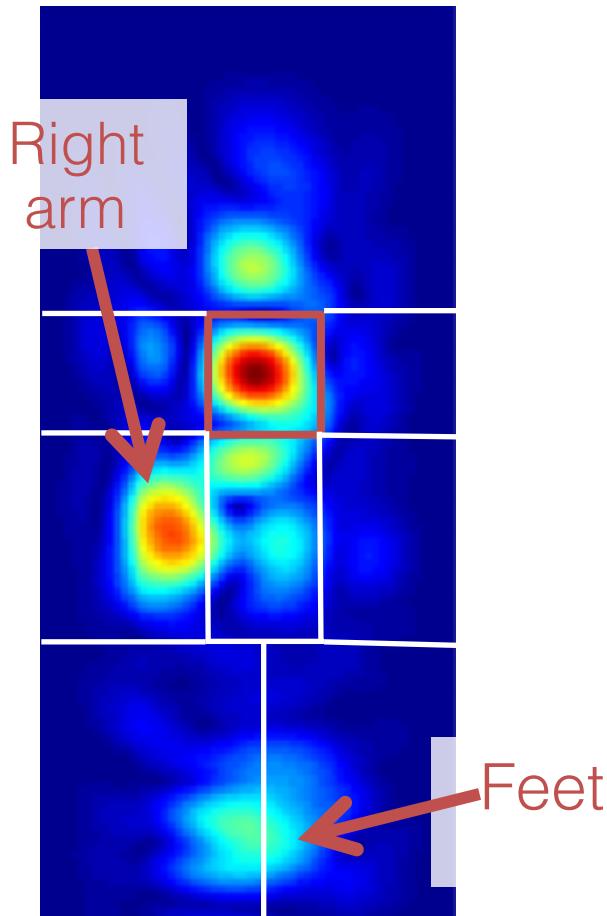
Chest (Largest Convex Reflector)



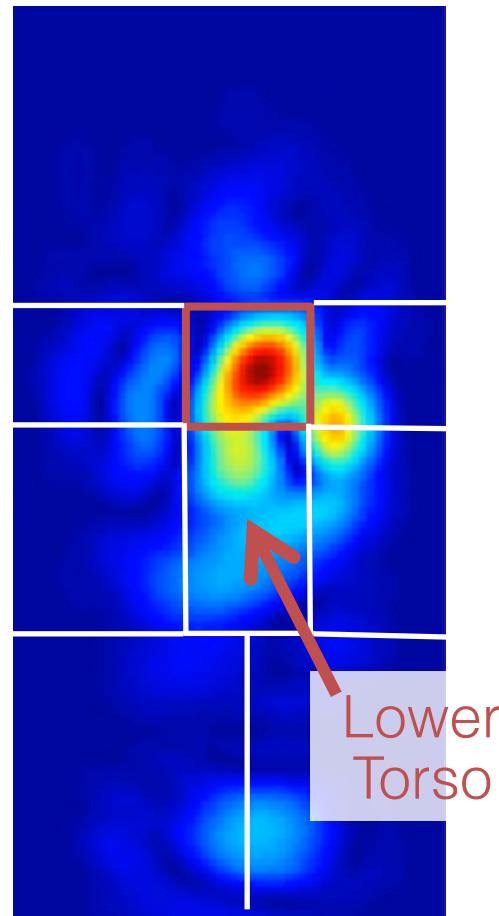
Use it as a pivot: for motion compensation and segmentation

Human Walks toward Sensor

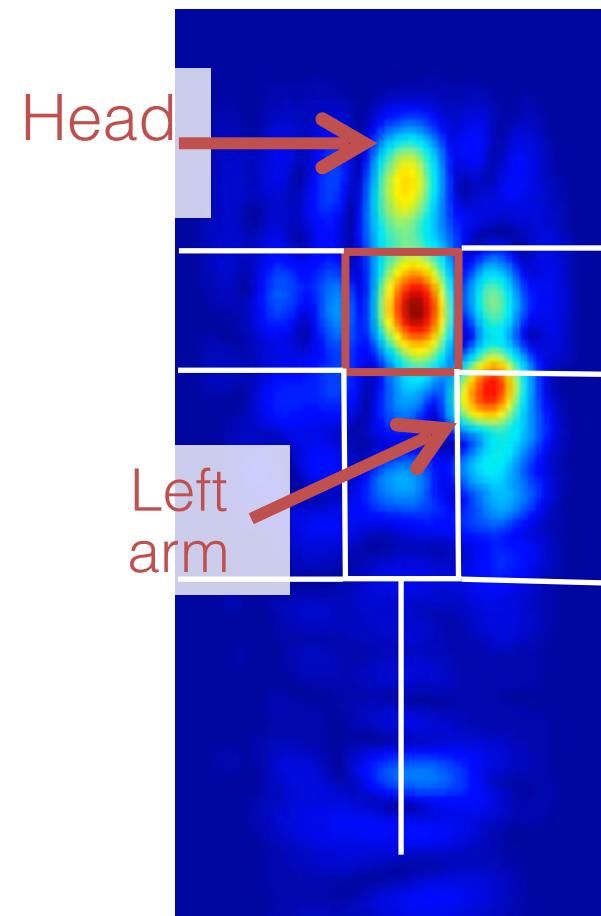
3m



2.5m



2m

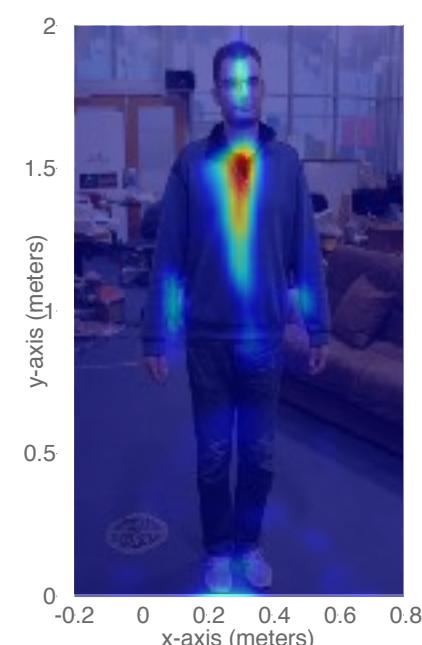
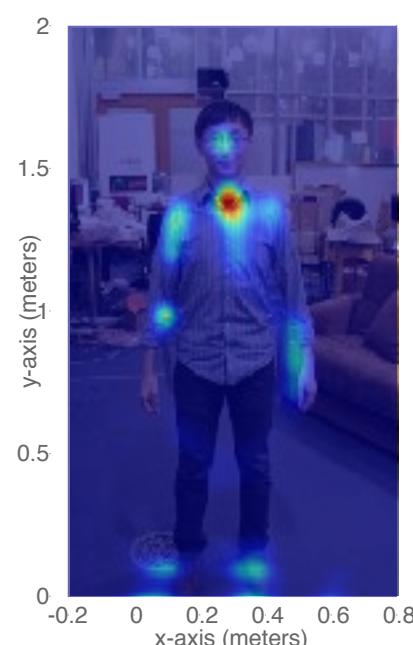


Combine the various snapshots

Human Walks toward Sensor



Sample Captured Figures through Walls



Through-wall classification accuracy of 90% among 13 users

