# TagScan: Simultaneous Target Imaging and Material Identification with Commodity RFID Devices

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#### Many applications are enabled by passive sensing



Gesture recognition



**Elderly Monitoring** 



Virtual Reality

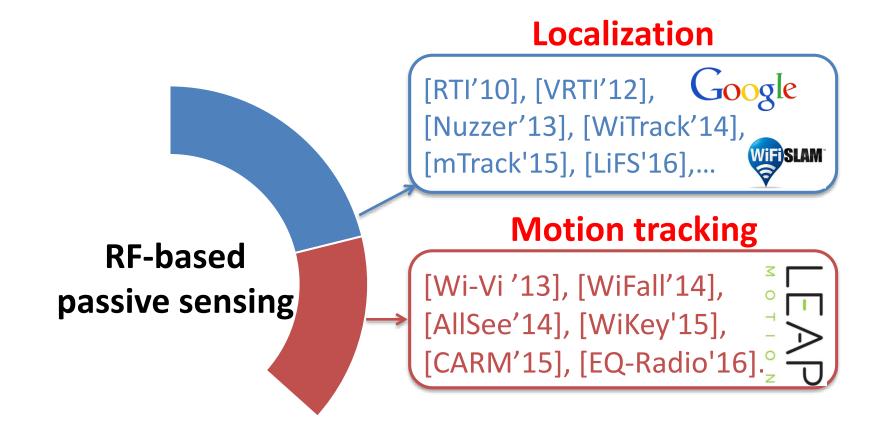


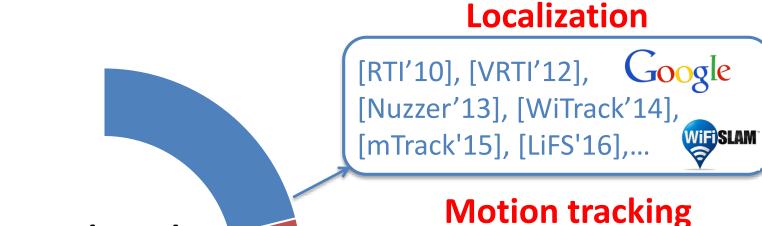
Intruder Detection



[RTI'10], [VRTI'12], Google [Nuzzer'13], [WiTrack'14], [mTrack'15], [LiFS'16],...

RF-based passive sensing





RF-based passive sensing

#### **Gesture recognition**

[WiSee'13], Microsoft

[E-eyes'14], [WiDeo'15],

[WiDraw'15], [D-Watch'16]...



[RTI'10], [VRTI'12], Google [Nuzzer'13], [WiTrack'14], [mTrack'15], [LiFS'16],...

#### Motion tracking

#### **Gesture recognition**

[WiSee'13], Microsoft

[E-eyes'14], [WiDeo'15],

[WiDraw'15], [D-Watch'16]...

RF-based passive sensing

Smart home,

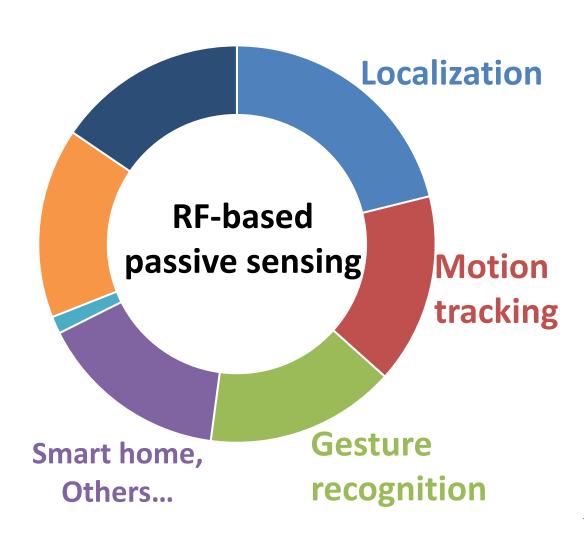
Others...

# Missing: target imaging and material identification

Target Imaging

Material Identification





# Applications of Target Imaging and Material Identification



**Robot Control** 

Robot adjusts its grip strength when picking egg and stone by using material identification



Detecting concealed weapons by knowing target shape and material type

Security checking

# **TagScan**

A system identifies a target's material and images its shape simultaneously

#### Low cost:

cheap commodity RFID device.

#### High accuracy:

- differentiating even Coke and Pepsi.
- Imaging the body shape accurately.

#### Easy deployment:

Utilizing the phase and RSS readings.

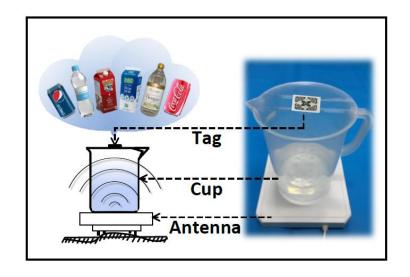
# How can we identify a target's material? ?

# How can we image a target's shape?

# **Preliminary studies**

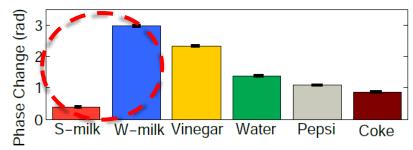
#### **Setup:**

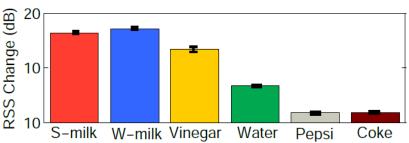
Place RFID tag on top of the cup and pour the same amount of liquid.



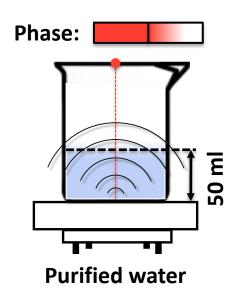
#### **Key Observations:**

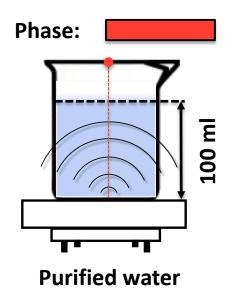
- Different liquids have different Phase/RSS changes.
- Even Coke and Pepsi have an around 0.2 radians phase change difference.





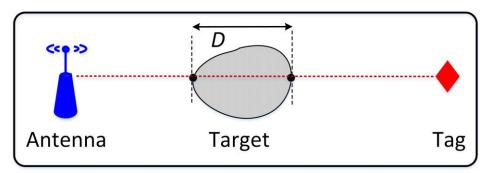
# Challenge: Without knowing the target size, identifying material type is challenging





#### Background and limitation of past approaches

Considering a target that blocks the direct path:



#### RF propagation property

- > Phase constant  $\beta$ : Phase changes  $\beta$  over a wavelength.
- > Attenuation constant  $\alpha$ : amplitude changes  $e^{-\alpha}$  over a unit distance.

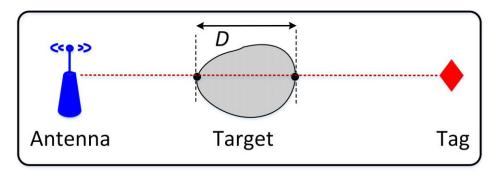
With Phase change  $\Delta \emptyset$  and RSS change  $\Delta R$ , we have:

$$-\Delta \emptyset = 2(\beta_{air} - \beta_{tar})D$$
 
$$\ln 10^{\Delta R/20} = 2(\alpha_{air} - \alpha_{tar})D$$
 Measurements Constant Unique for each material type

Past approaches use  $\alpha_{tar}$  and  $\beta_{tar}$  for material identification

#### Background and limitation of past approaches

Considering a target that blocks the direct path:



#### RF propagation property

- > Phase constant  $\beta$ : Phase changes  $\beta$  over a wavelength.
- > Attenuation constant  $\alpha$ : amplitude changes  $e^{-\alpha}$  over a unit distance.

With Phase change  $\Delta \emptyset$  and RSS change  $\Delta R$ , we have:

2 Equations 
$$\begin{cases} -\Delta \emptyset = 2(\beta_{air} - \beta_{tar})D \\ \ln 10^{\Delta R/20} = 2(\alpha_{air} - \alpha_{tar})D \end{cases}$$
 - - 3 Unknowns

2 equations can not solve 3 unknowns!

#### **Our solution:**

By removing the unknown D, we define a feature:

$$\Omega = \frac{\ln 10^{\Delta R/20}}{\Delta \emptyset} = \frac{\alpha_{air} - \alpha_{tar}}{\beta_{tar} - \beta_{air}}$$

#### **Advantage:**

•  $\Omega$  is unique for each material and independent of D.

#### **Our solution:**

By removing the unknown D, we define a feature:

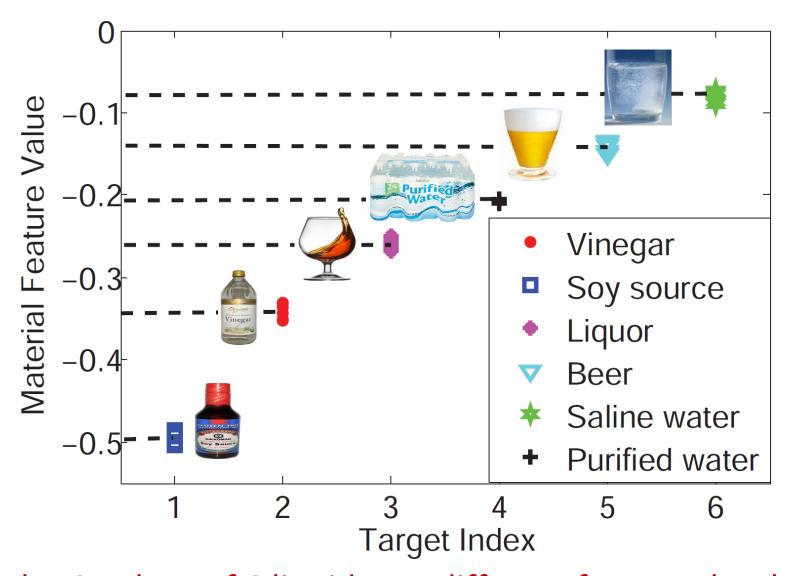
$$\Omega = \frac{\ln 10^{\Delta R/20}}{\Delta \emptyset} = \frac{\alpha_{air} - \alpha_{tar}}{\beta_{tar} - \beta_{air}}$$

#### **Advantage:**

- $\Omega$  is unique for each material and independent of D.
- $\Omega$  can be calculated from RSS and phase readings.

Without knowing the target size, we employ the new feature  $\Omega$  for material identification

### Differentiating materials with feature $\Omega$



The  $\Omega$  values of 6 liquids are different from each other. 17

# How can we identify a target's material? ?

# How can we image a target's shape?

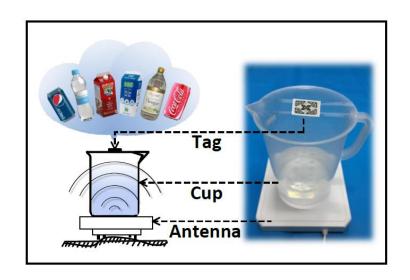
# **Preliminary studies**

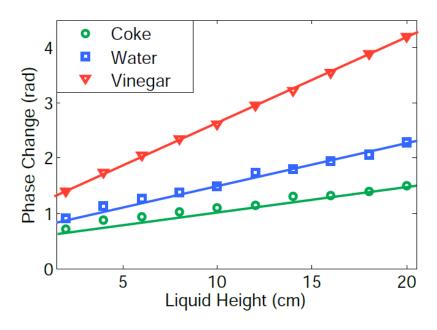
#### **Setup:**

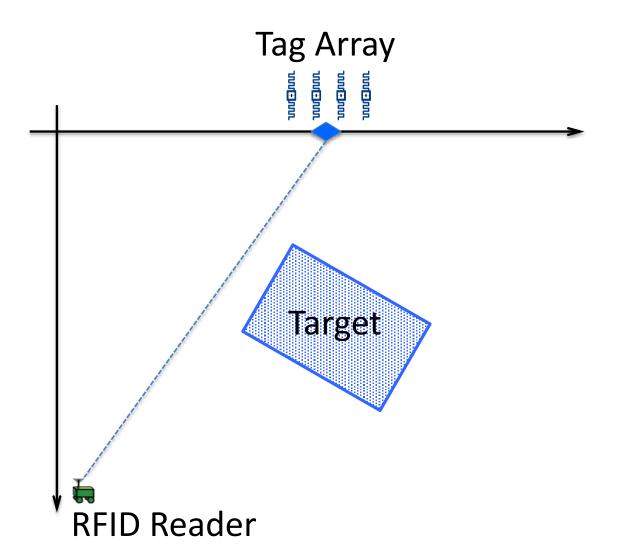
Pour a liquid into the cup and increase the liquid height.

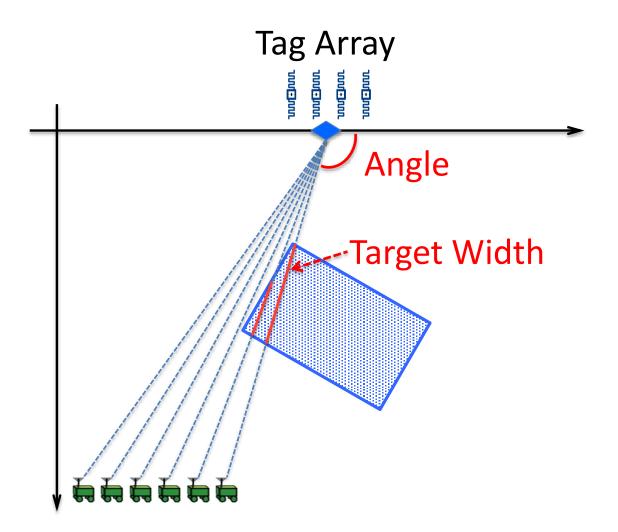
#### **Key Observation:**

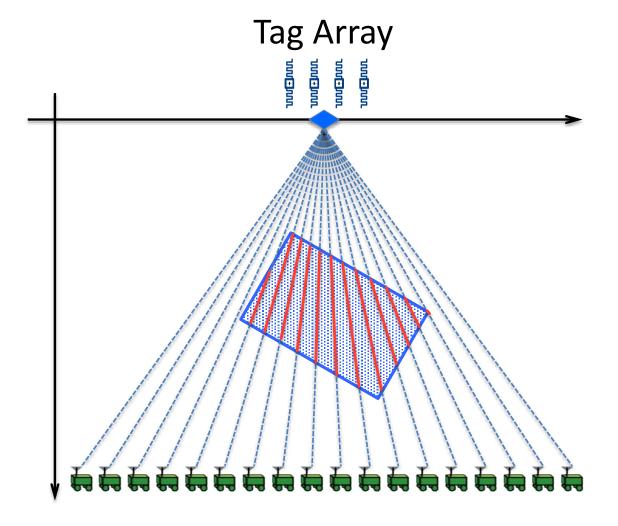
 Linear relationship between phase changes and liquid heights (i.e. target widths).



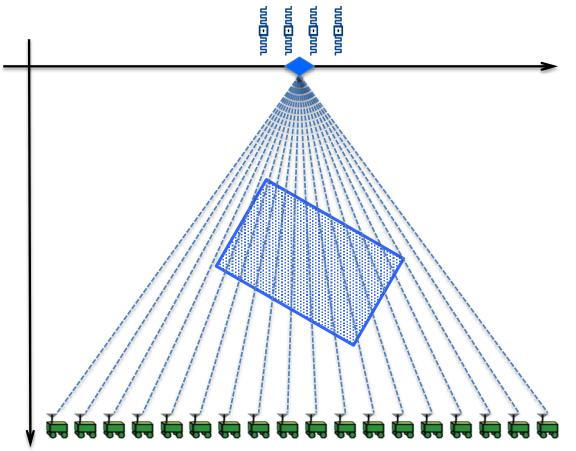


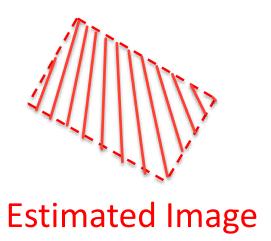






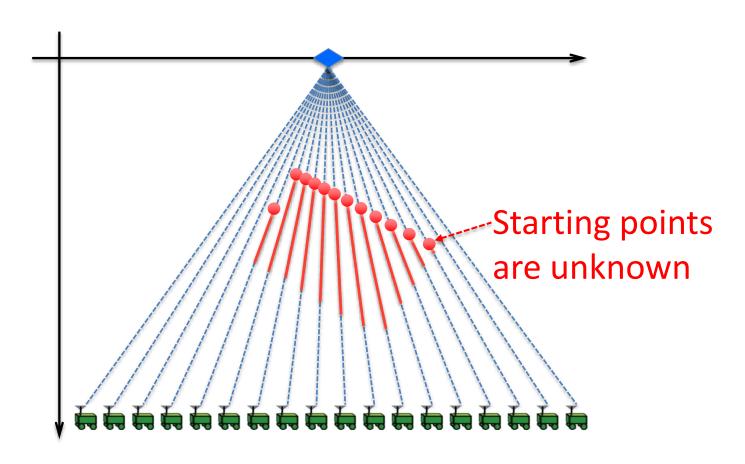






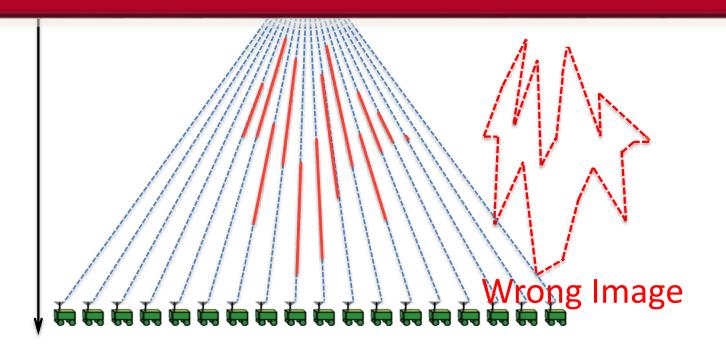
# Challenge: Stitching target widths for imaging is non-trivial

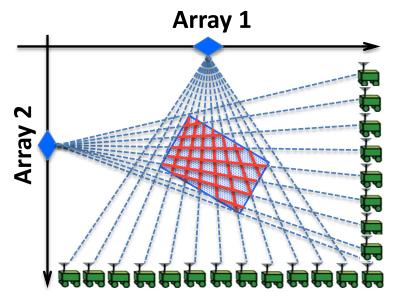
#### Starting points of target widths are unknown;



# Starting points of target widths are unknown; As a result, we may obtain wrong images:

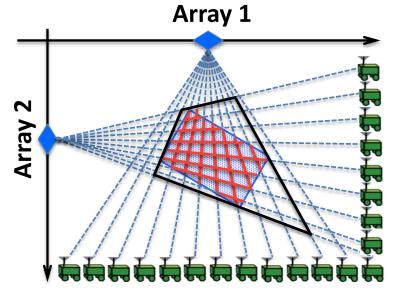
# How can we solve this problem?

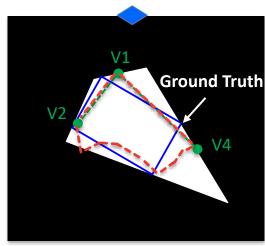




#### **Key Observation:**

 Images estimated from different arrays align well if the starting points are estimated correctly.

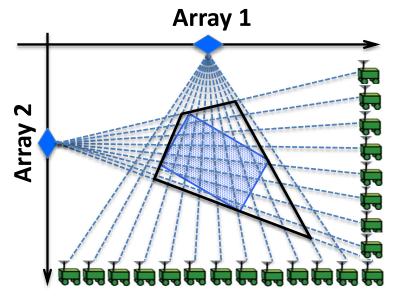


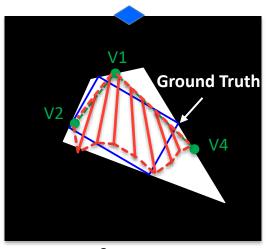


V2 Ground Truth

Image from Array 1

**Image from Array 2** 





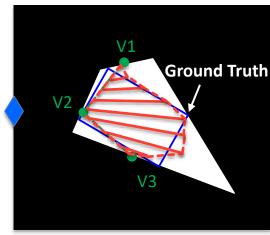
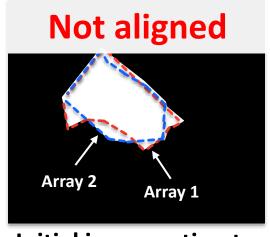
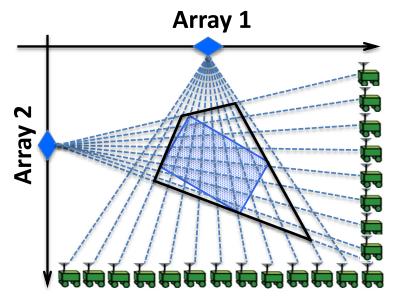


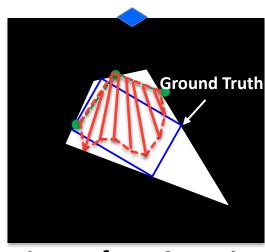
Image from Array 1

**Image from Array 2** 



Initial image estimate

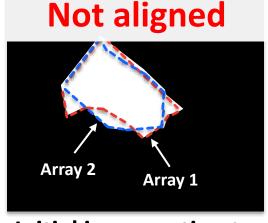




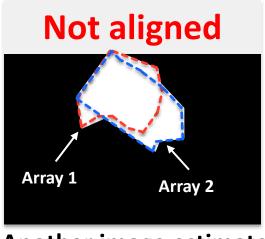
Ground Truth

**Image from Array 1** 

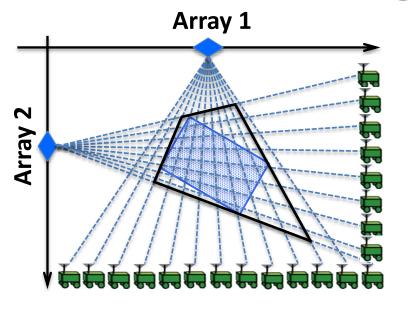
**Image from Array 2** 

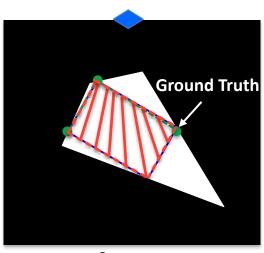


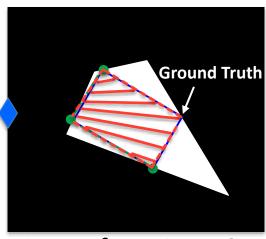
Initial image estimate



**Another image estimate** 

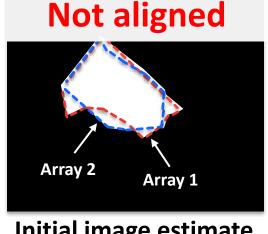




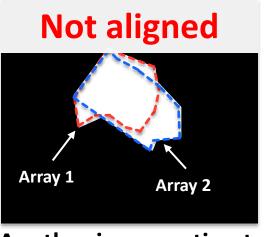


**Image from Array 1** 

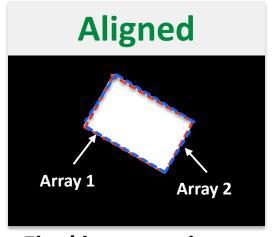
**Image from Array 2** 



Initial image estimate



**Another image estimate** 

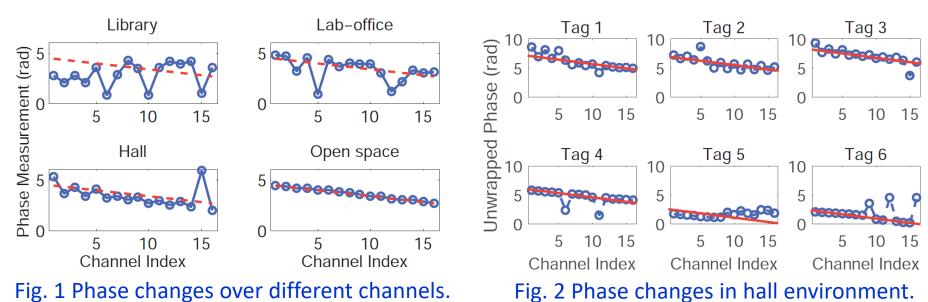


Final image estimate

# Multipath Problem:

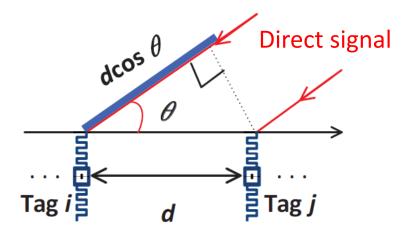
Multipath signals break the linear relationship between phase change and target width

#### Stage 1: Identifying the "clean" channels and tags



However, this works well only in the environment with little multipath

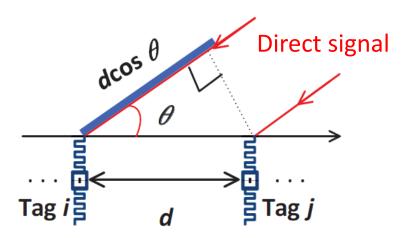
#### Stage 2: Enhancing the direct-path signal



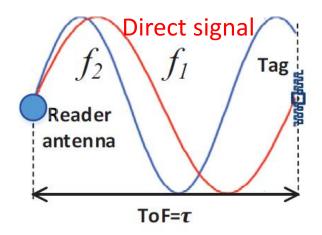
(a) Phase shift of  $\frac{4\pi f}{C} d \cos(\theta)$  at two adjacent tags.

Tag *i*:

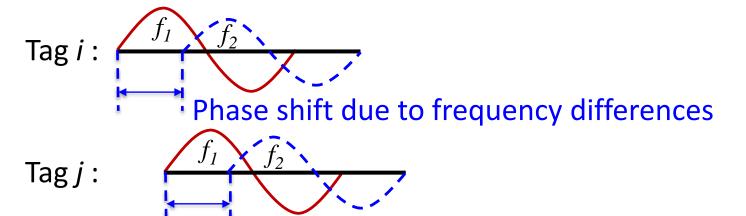
#### Stage 2: Enhancing the direct-path signal



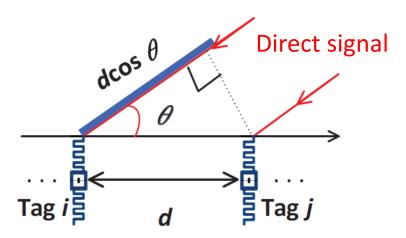
(a) Phase shift of  $\frac{4\pi f}{C} d \cos(\theta)$  at two adjacent tags.



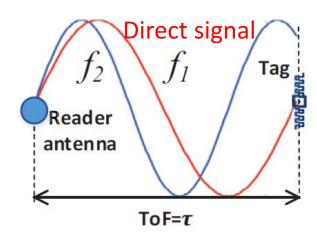
(b) Phase shift of  $4\pi \tau \Delta f$  at two adjacent channels.



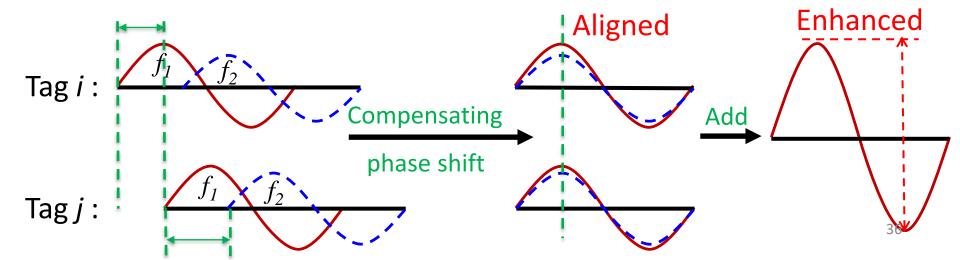
#### Stage 2: Enhancing the direct-path signal



(a) Phase shift of  $\frac{4\pi f}{C} d \cos(\theta)$  at two adjacent tags.



(b) Phase shift of  $4\pi \tau \Delta f$  at two adjacent channels.



# Implementation & Evaluation

# **Implementation**

- Reader and Tag: one Impinj Speedway R420 readers; 16 cheap Alien ALN-9634 tags.
- Environments: Hall, lab-office and library, w.r.t, low, medium and high multipath.





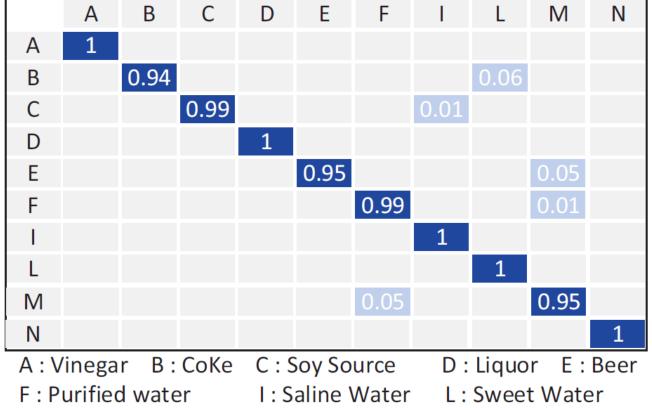




#### **Material Identification Performance**



## **Material Identification for 10 Liquids**



M: Whole milk

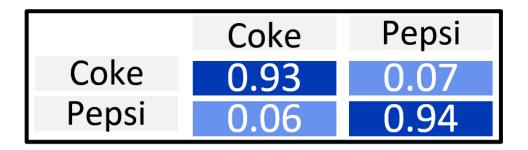
N: Skimmed milk

Material identification accuracy is higher than 94%.

## Similar Liquid Material identification



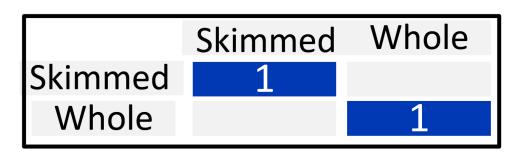




Higher than 90% accuracy for identifying Coke and Pepsi.

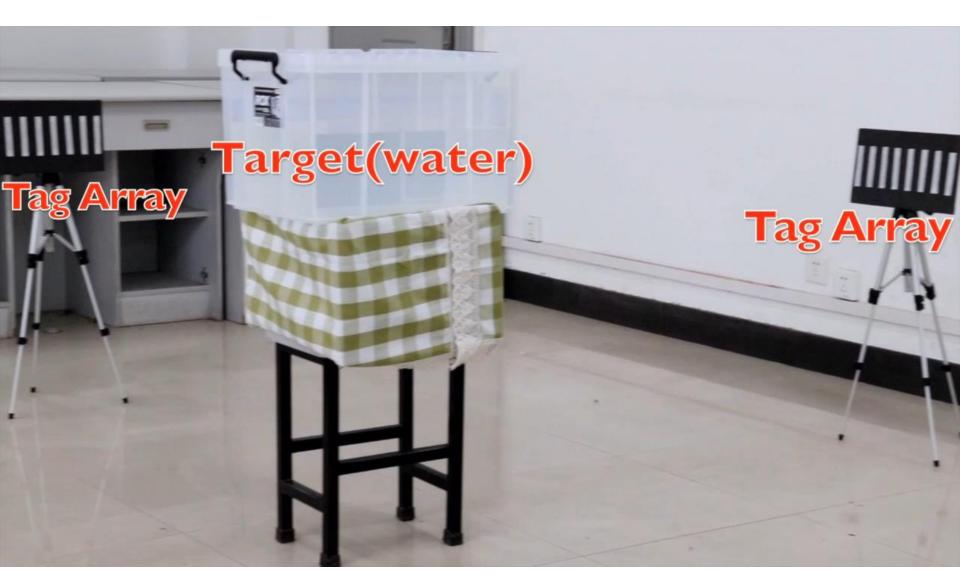




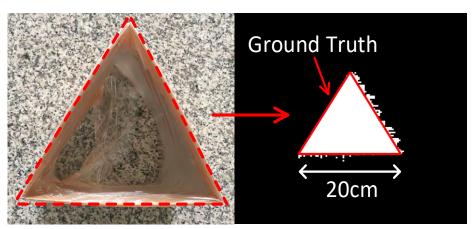


100% accuracy for identifying Skimmed and Whole milk.

# **Target Imaging Performance**



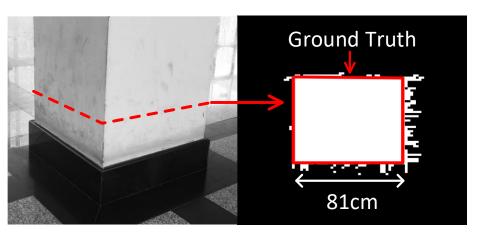
# Imaging for Target with Different Shapes and Materials



Triangle shape (plastic & water)



Hexagonal shape (plastic & water)

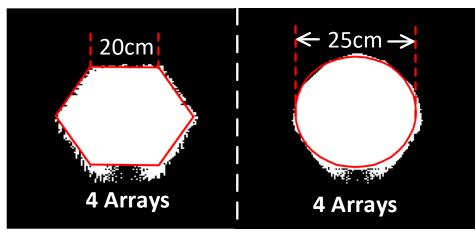


Rectangular shape cement pillar



Circular shape (plastic & water)

# Imaging for Target with Different Shapes and Materials



Two more arrays added!

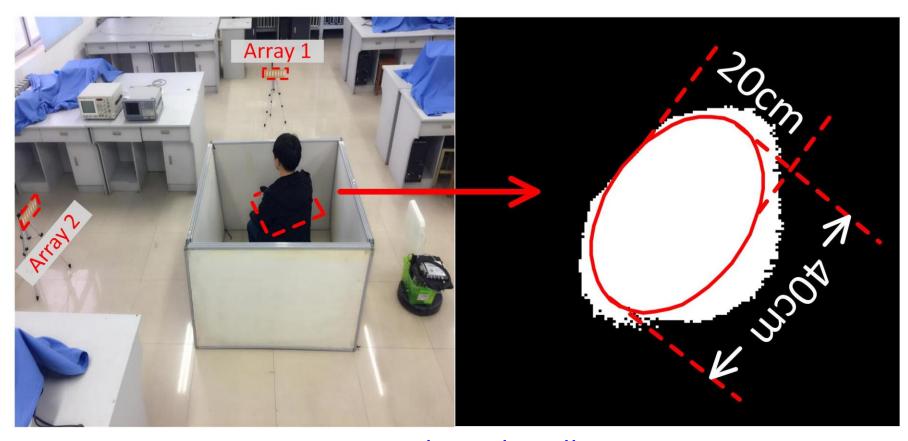


Hexagonal shape (plastic & water)



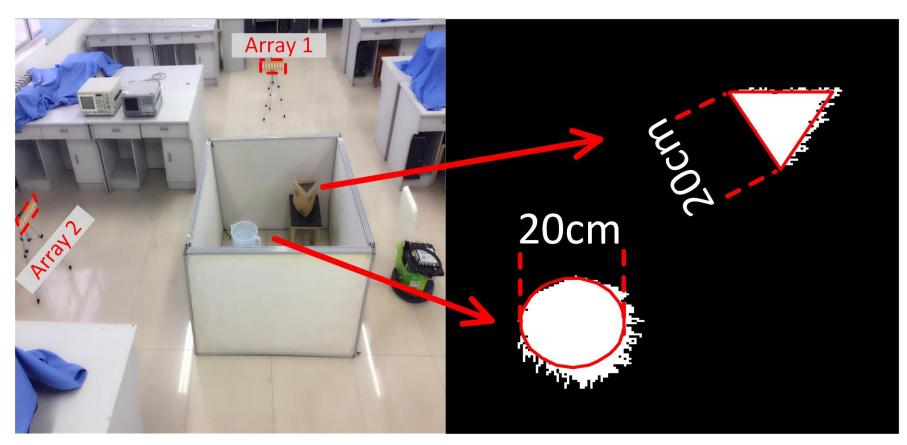
Circular shape (plastic & water)

# See-through the wall imaging



Human target through wall imaging

# See-through the wall imaging



Two-target through wall imaging

### Conclusion

- TagScan performs material identification and target imaging simultaneously.
- A new approach to identify materials, independent of target size.
- A novel method for imaging targets, using RSS and phase.