#### Pharos: Enable Physical Analytics through Visible Light based Indoor Localization

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## Background

- GPS-like indoor localization is important
- Mainstream localization approach: WiFi-based
- Growing demand for fine-grain indoor localization
  - Indoor navigation: navigate to a physical object
  - Physical analytics: which object customer spend time at



#### WiFi Localization primer

- Trilateration:
   Calculate position from distances to WiFi APs
- Angle of Arrival: Calculate position from angles to WiFi APs



#### WiFi Localization primer

Fingerprinting:

Calculate position from known positions with similar WiFi signals in a location database

AP1 AP2 Fingerprints at known locations Unknown location

Localized position

#### Why Visible Light indoor localization?



#### More accurate by leveraging the existing infrastructure!

## Basic Concept



#### Multi-lateration approach

(1) LED lights broadcast IDs and their position information

(2) Cellphone received IDs and estimates signal strength

(3) Cellphone calculates distances to LEDs via optical channel model

(4) Cellphone resolves its position via multiple distance estimates

No finger printing -> without pain!

#### Outline

- Model
- Design
- Evaluation
- Summary



### Model: Optical Channel

$$P_r = C \cdot \sin(\alpha \pi) \cdot \frac{\cos \theta \cdot \cos \phi}{d^2}$$

C Normalized Constant  $\sin(\alpha \pi)$  Light luminance



#### Model: Optical Channel



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#### Design: Beaconing Opportunity

LED lights adjust 60% Duty Cycle
 its luminance by switch on and off very fast. 20% Duty Cycle

2`

#### Design: Beaconing with BFSK

- Rationale:
  - Concurrent decoding
  - Avoid flicker



#### Design: Practical Considerations

- Choosing the right method for communication
  - LED lights support up to 100kHz
  - Must be higher than 200Hz to avoid flicker
  - Stay away from 50/60Hz interference
  - Avoid self-interference by harmonics



- Result: Frequency divided multiplexing
- 30 channels from 10kHz to 19kHz
- Frequency hopping to avoid static channel assignment

# Design: Calculate

• No explicit solution, using Newton's method to solve it.

$$P_{r}(i) = C_{i} \cdot \sin(\alpha_{i}\pi) \cdot \frac{\cos \theta_{i} \cdot \cos \phi_{i}}{d_{i}^{2}}$$

$$P_{r}(i) \text{ Received signal strength from i-th LED}$$

$$\alpha \text{ Duty cycle of the LED}$$

$$C_{i} \text{ Normalized constant}$$

$$\frac{\cos \theta_{i} \cdot \cos \phi_{i}}{d_{i}^{2}}$$

# Design: Hardware

- Hack the dimmer with our control board
- The sample rate of light sensor on cellphone is limited, using external one via audio jack instead.





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#### Evaluation: Modulation



ID\_a: 0x0F0F0F0A... ID\_b: 0x0F0FAF1F...

Ch\_a: 10 KHz Ch\_b: 11 KHz Ch\_c: 12 KHz

Data rate: 32 bit/s Sampling freq: 44.1 KHz



#### Evaluation: Localization

• Localization scenario:







(b) Cubicle Area

#### Evaluation: Experimental Results



#### Evaluation: Accuracy Comparison

Maximum error at 90 percentile of different methods:

Name	EZ MobiCom'10	Radar INFOCOM'00	Horus MobiSys'05	PinPoint NSDI'13	ArrayTrack NSDI'13	Pharos This paper
Accuracy	2~7m	3~5m	~1m	2~3m	~0.9m	0.4~0.7m
Method	Model	Fingerprint	Fingerprint	Angle	Angle	Model
Database	Yes	Yes	Yes	No	No	No
Overhead	Minimum	Wardriving	Wardriving	Dense AP	16 Antennas	LED Light

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#### Summary

- Visible light offers opportunities to perform fine-grained localization
  - Dense deployment
  - Stable signals

Thank you!



#### Optical Channel vs Radio Channel



• Stable, no fluctuation.

• Unstable, Rayleigh fading.

### Additional questions

- You said light channel is stable, but just like radio, light is actually bounced back and forth in indoor environment. Why it does not affect the model?
- Why you design your own LED lights, instead of buying commercial ones?