



# UWB Localization and Mapping Using Computational Imaging

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**#PSCR2019** 

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#### UWB Localization and Mapping Using Computational Imaging

- Motivation/Goals/Challenges
- Information Theory Approach
- Physics of Field Compressive Sampling and Sensing
- Implementation
- Results and discussion

#### Motivation

What location information is still lacking in mission critical events such as a fire in a building?

#### Situational awareness challenge

- Can we infer what's going on inside?
- How fast can we have the information?
- How accurate is the information?
- Can we track the situation in real time?



#### Goal

#### Localization and mapping with RF signals

#### RF Paradigm Challenge

- 1 m resolution
- One-way comms minimum
- Real-time (0.1 s refresh rate)
- Range of 1-100 m
- Infrastructure free
- Readily deployable (1-5 min)
- No (minimum) interference



Radar-based technology

#### Implementation challenge

- Multi-static radar array Tx
- Few (one) receivers Rx
- Deployable footprint
- Signal controls
- Signal processing (model)
- Visualization



## **Information Theory Approach**

How much information are we after?

- 3D structures are mostly empty
- What is not empty...
  - Can be static or dynamic
  - Is opaque to visible light
  - Is semi transparent to RF
  - Is information
- How do we measure this information?
  - We sample it first with RF waves
  - Then we sense what comes back:
    - What comes back is all the information we have and need!



## Information Theory Approach

How much information are we after?

- If the scene has volume **N** and
- What is not free space has volume **K**
- Then the probability of not finding free space in the scene is p = K/N
- The information in the scene is thus:  $I = -p \log(p) - (1-p) \log(1-p)$
- From which we conclude, if  $p \ll 1$ :  $M \ge K \log\left(\frac{2N}{K}\right)$



How are measurements modeled? The **sampling** part.

How are measurements modeled? The **sensing** part.

- Background subtraction
- The geometry of sensing synchronously:

$$ct = \sum_{i=0}^{n} r_i$$

• The weight functions

$$W = \prod_{i=0}^{n} \frac{1}{r_i}$$



Antenna array setup



Background subtraction









Pseudo-random binary sequences



Image recovery





Imaging



Imaging



Interference

- Typical sensing times: 4  $\mu s$
- RMS Power: 5.88 W (12 Tx)
- Bandwidth: 1 GHz (500-1500 MHz)
- RMS Power: 6.55 dBm/MHz
- Duty cycle: 0.02 % (50 Hz rate)
- RMS (duty cycle): -60.44 dBm/MHz



## Discussion

A realistic prototype goal

#### **RFt PatriachiagIna What hemse** challenge

- Can wee ohfeiowhlat's thein gamme side?
- One and code approviation work RE power
- · Heaventer the terms terms the terms term
- Rånge of 1910 metresh rate) for position
- Infrastructure free: How accurate is the information? Readily deployable (1-5 min):
  - (mapping still affected by delays) (um) interference: ?
- No
- Can we track the situation in real time?
  - Yes, the system responds dynamically to the scene







# THANK YOU

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#### Come see our demo later today



## **#PSCR2019**

Come back for the **Next Session 1:50 PM** 

How are measurements modeled? The **sampling** part.

• Wave Equation for a general source:

$$\nabla^2 E^{(0)} - \frac{1}{c^2} \frac{\partial^2 E^{(0)}}{\partial t^2} = S(t', \mathbf{r}')$$

- Solution for a point source  $S(t', r') = \delta(t', r')$ :  $E^{(0)}(t, t', r, r') = G(t, t', r, r') = \frac{\delta(t' - [t - |r - r'|/c])}{|r - r'|}$
- First order scattering off an object:

$$E^{(1)}(\mathbf{r},t) = \int G(t,t',\mathbf{r},\mathbf{r}') E^{(0)}(t',\mathbf{r}') x^{(0)}(\mathbf{r}') dt' d\mathbf{r}'$$

How are measurements modeled? The **sampling** part.

• Second order scattering off an object:

$$E^{(2)}(\mathbf{r},t) = \int G(t,t',\mathbf{r},\mathbf{r}') E^{(1)}(t',\mathbf{r}') \Big[ x^{(0)}(r') + x^{(1)}(r') \Big] dt' d\mathbf{r}'$$

• nth order scattering from J transmitters  $E^{(n)}$  is:

$$\int G(t,t',\boldsymbol{r},\boldsymbol{r}') E^{(n-1)}(t',\boldsymbol{r}') \Big[ x^{(0)}(r') + \dots + x^{(n-1)}(r') \Big] dt' d\boldsymbol{r}'$$

$$E^{(n)}(\mathbf{r},t) = \sum_{j=1}^{J} E_{j}^{(n)}(\mathbf{r},t)$$

How are measurements modeled? The **recovery** part.

• The first-order scattering equation:

$$E^{(1)}(\mathbf{r},t) = \int G(t,t',\mathbf{r},\mathbf{r}') E^{(0)}(t',\mathbf{r}') x^{(0)}(\mathbf{r}') dt' d\mathbf{r}'$$

- Can be cast in matrix form for a receiver at the origin, r = 0:  $y = A^{(0)} \cdot x^{(0)}$
- Recovery from first-order scattering:

$$x = (A^T \cdot A)^{-1} A^T \cdot y \qquad \frac{\min \|x\|_1}{x \in \mathbb{R}^d} \quad y = A \cdot x$$

#### Interference

50 Ohm matched output power calculations				
Vpp	7	V		
Vrms	4.95	V		
Load	50	Ohm		
Burst duration	4	us		
Burst repetition rate	50	Hz		
Duty cycle	0.020%			
Total Burst Power Used Per Box (3 channels)				
	Peak	RMS		
Per transmitter	0.98	0.49	W	
Box 1 (3 channels)	2.94	1.47	W	
Box 2 (3 channels)	2.94	1.47	W	
Box 3 (3 channels)	2.94	1.47	W	
Box 4 (3 channels)	2.94	1.47	W	
Total	11.76	5.88	W	
	40.7	37.7	dBm	
				Based on
Bandwidth start	200	200	3 dB point	antenna
				specs
				Based on
				signal
Bandwidth end	1500	1500	3 dB point	specs
				through
				cable
Power density	0.009	0.005	W/MHz	
	9.56	6.55	dBm/MHz	
Duty cycle average	1.8E-06	9.0E-07	W/MHz	
	-57.43	-60.44	dBm/MHz	