

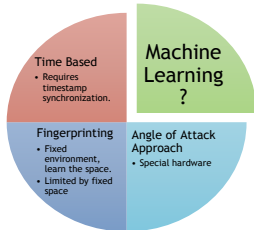
Localization through Wireless Access Point Channel State Information

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Goals

- Estimate distance from WiFi AP at sub-meter accuracy
 - Can triangulate to calculate global coordinates
- Use commodity hardware, no custom equipment
- Software-only solution
- Currently owned technology

Current Solutions



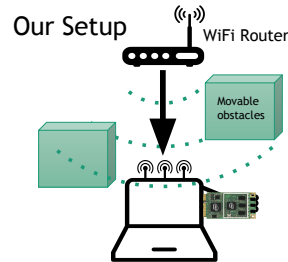
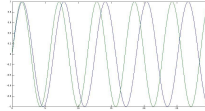
Wi-Fi background



- OFDM scheme
- Each subcarrier separated by 312.5kHz
- Each channel separated by 20/40 Mhz

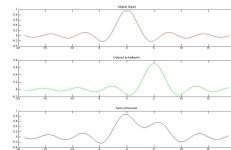
Principle of Operation

- Carriers are synchronized at transmit
- Phase angle between subcarriers encodes Time of Flight (ToF)
- Phase angle between antennas encodes Angle of Attack (AoA)

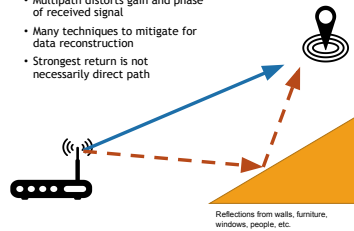


Multipath

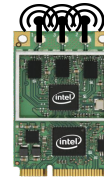
- Multiple reflection paths convolves signal
- Only direct path corresponds to ToF



- Multipath distorts gain and phase of received signal
- Many techniques to mitigate for data reconstruction
- Strongest return is not necessarily direct path



Data Collection



Training
2m - 20m

- Laptop with Intel IWL5300
- Linux 802.11n CSI Tool: custom firmware for accessing channel state information

Each of 1 million packets:
3 Antennas
30 Subcarrier Groups
Gain & Phase of Signal
=180 features

Feature Generation

- We chose [Kernel Ridge Regression](#)
- Experimented with multiple packets per training sample
- Random sampling from full training set
- Explored pairwise multiplication
- Generalization error obtained through [K-Fold Cross Validation](#)

Results (KRR)

#1 Proof of Concept: Calculated Gaussian Kernel by randomly subsampling 2000 points and computing Mean Squared Distance between the 2000 pairs for gamma. [Data taken at 2m-4m] → [10 packets]=1800 features per sample.	RMS Error: 0.96m
#2 Expanding Dataset: [Data taken at 2m-15m] → [10 packets]=1800 features per sample.	RMS Error: 2.78m
#3 Reduction in Sampling: [2m-15m] → [10 packets]*[Real, Imaginary, Gain, Phase]=3600 features per sample. Limit to 4000 samples per distance.	RMS Error: 3.1m
#4 Experimentation with Gamma: [2m-15m, 4000 Sample/Dist] [10 packets]*[Gain, Phase]=1800 features per sample. Conclusion: original gamma is better.	 RMS Error: 2.66m

#5 Experimenting with pairwise multiplication: [2m-15m, 4000 Sample per distance] [2 packets + every pairwise multiplication]=65K features/sample.	RMS Error: 1.27m
#6 Trying more packets: [2m-15m, 4000 Sample per distance] [3 packets + pairwise]=140K features/sample.	RMS Error: 1.3m
#7 Trying more packets: [2m-15m, 4000 Sample per distance] [4 packets + pairwise]=200K features/sample.	RMS Error: 1.66m
#7 Self Multiply only [2m-15m, 4000 Sample per distance] [4 packets + pairwise within packet]=65K features/sample.	RMS Error: 2.15m
#7 Self Multiply only [2m-15m, 4000 Sample per distance] [10 packets + pairwise within packet]=161K features/sample.	RMS Error: 2.66m