



# Finding Convex Hulls of Agents with Sensor Networks

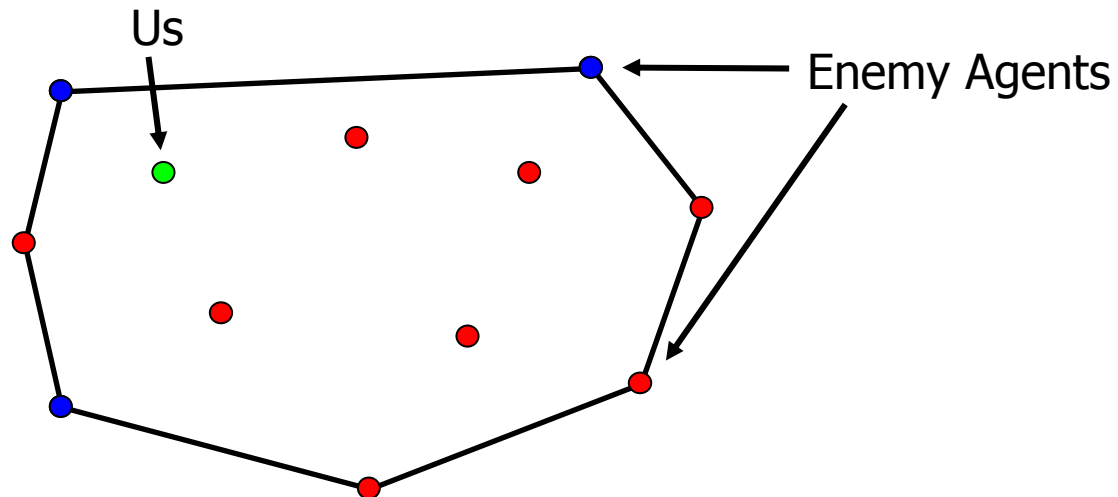
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CS428 Project  
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# Introduction

- Relational approach to algorithm design
- Determine if agent is surrounded by enemies
- Minimize number of sensor queries required





# Overview

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- Introduction
- Problem Definition
- Generative Model
- Inference in the Network
- Integrated Sensor Selection Techniques
- Experimental Results
- Conclusion



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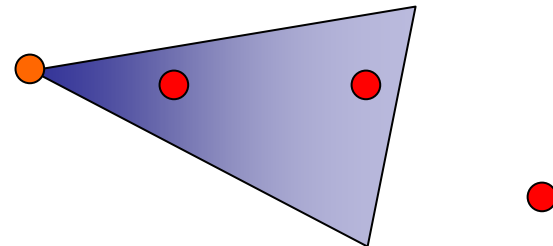
# Problem Definition

- LF in convex hull with high probability?
- PIR and Amplitude sensors
- Known
  - LF (location of friendly agent)
  - $S_1 \dots S_M$  (type of each sensor)
  - $LS_1 \dots LS_M$  (locations of sensors)
  - $C_1 \dots C_T$  (sensor observations)
- Unknown
  - $LE_1 \dots LE_N$  (locations of enemy agents)



# PIR Sensors

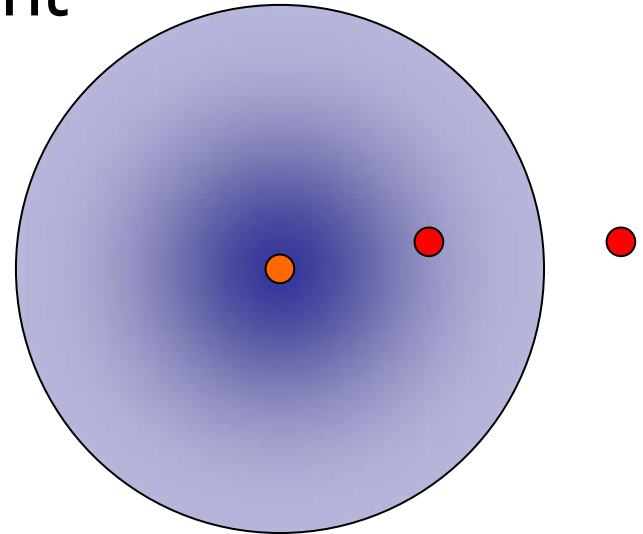
- Passive Infrared Intrusion Sensor
- Detects agents in triangle adjoining sensor
- Algorithm choose direction of sensing
- $P(d \mid d') = 1 - 0.2 * p$
- $P(d \mid \neg d') = 0.1$





# Amplitude Sensors

- Detects enemy in circle surrounding sensor
- Returns presence and distance to nearest agent
- $P(d \mid d') = 1 - 0.2 * p$
- $P(d \mid \neg d') = 0.1$
- $s \sim N(s', u)$





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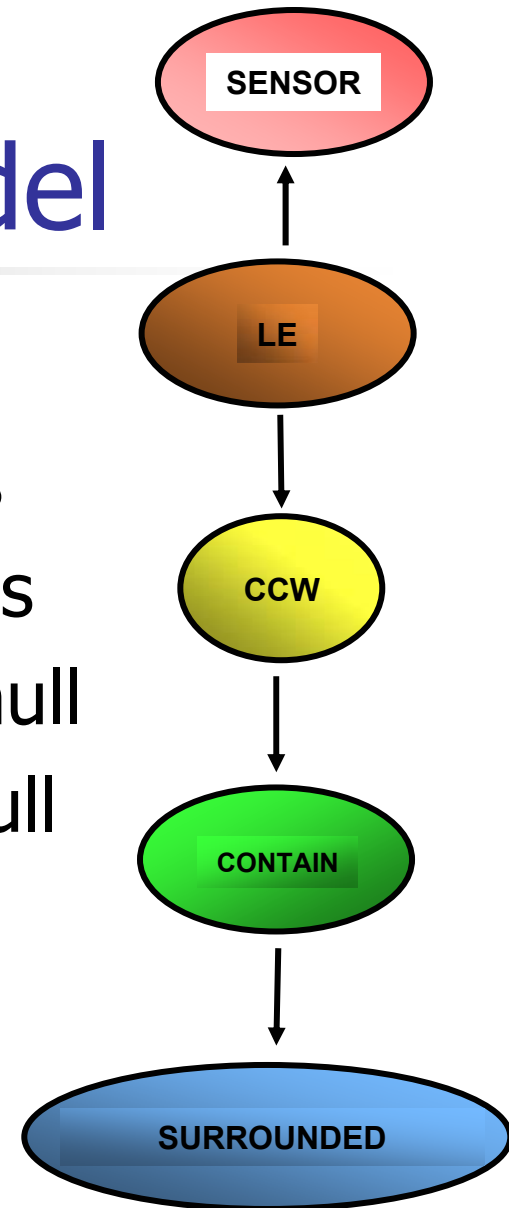
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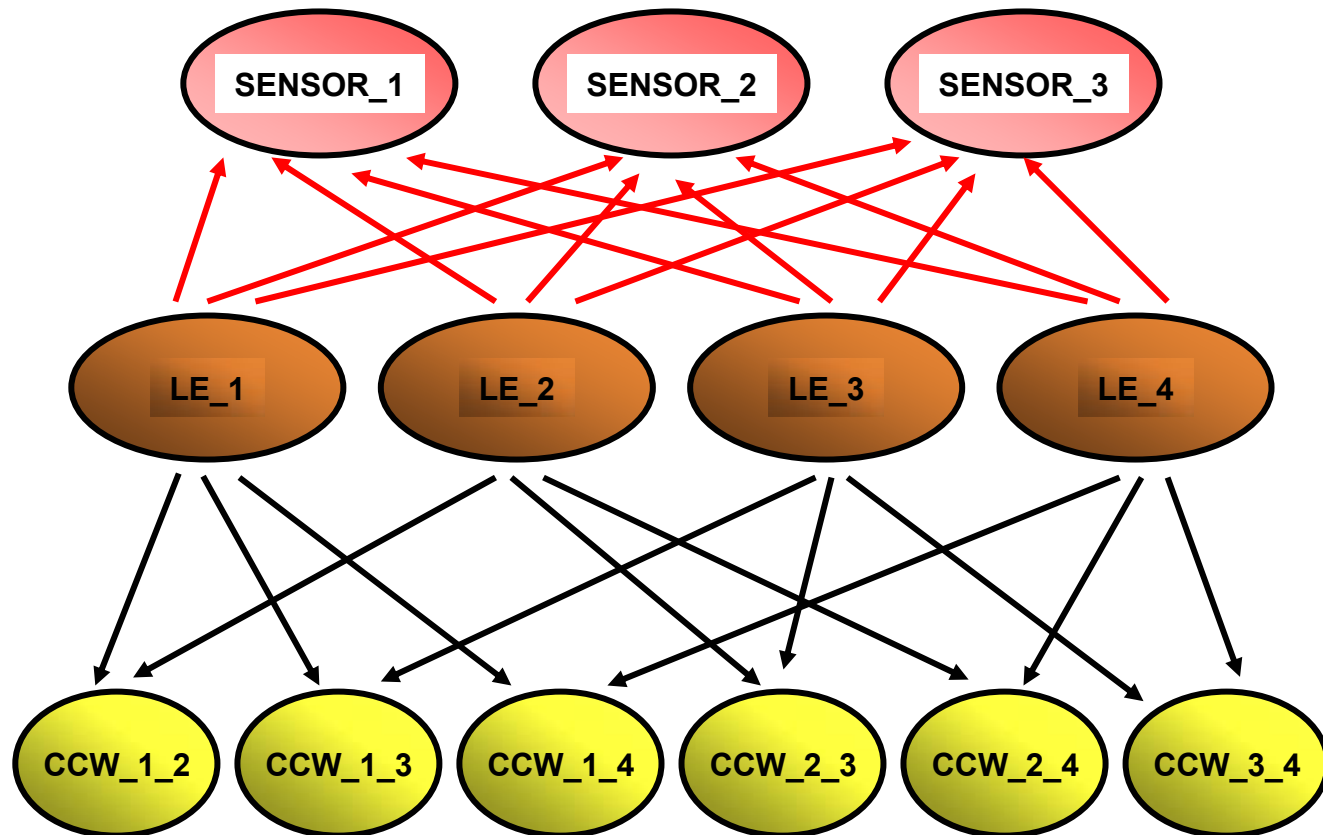
# Generative Model

- SENSOR Results of sensing
- LE Locations on enemies
- CCW CCW over LE variables
- CONTAIN LF in subset convex hull
- SURROUNDED LF in entire convex hull



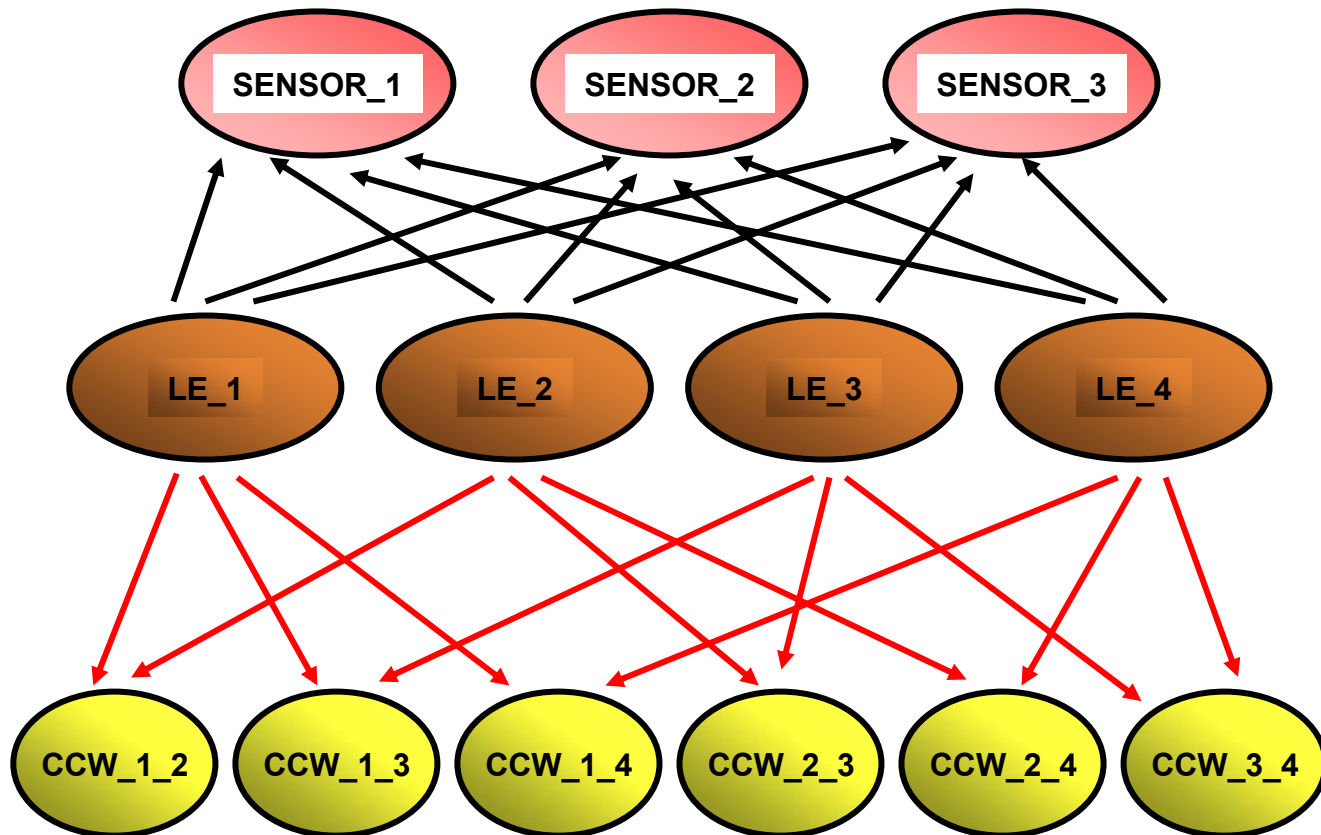


# Generative Model



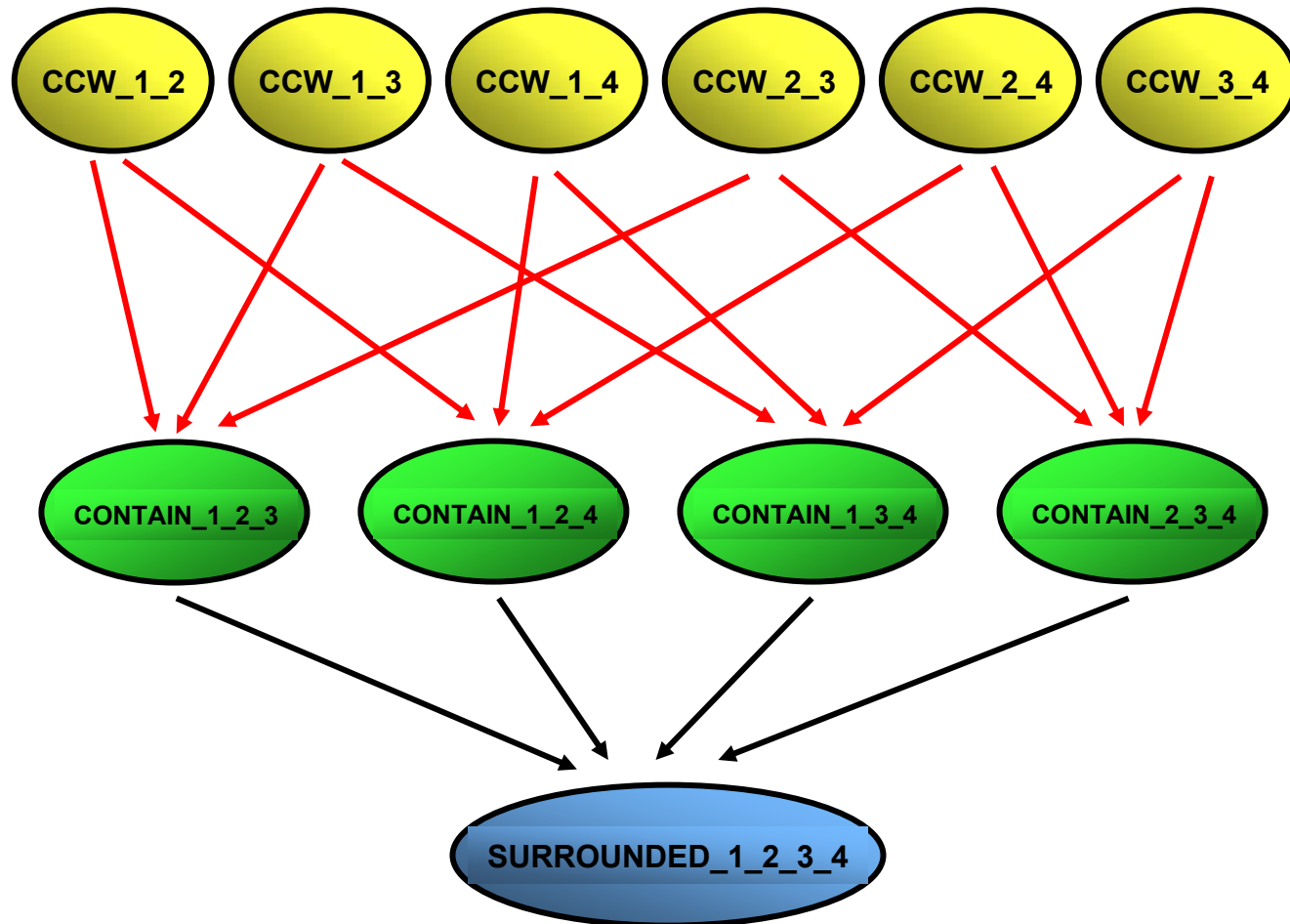


# Generative Model



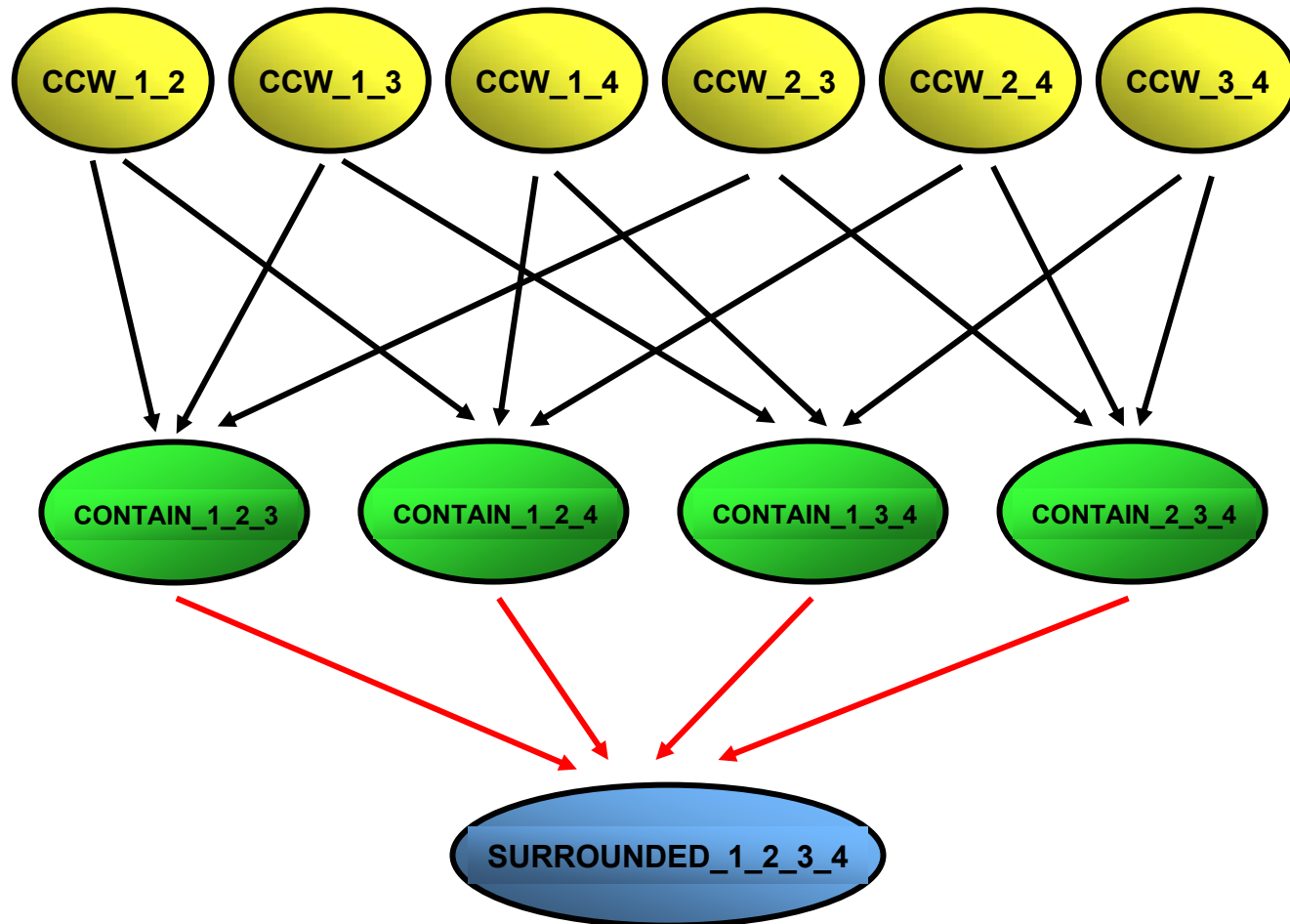


# Generative Model





# Generative Model





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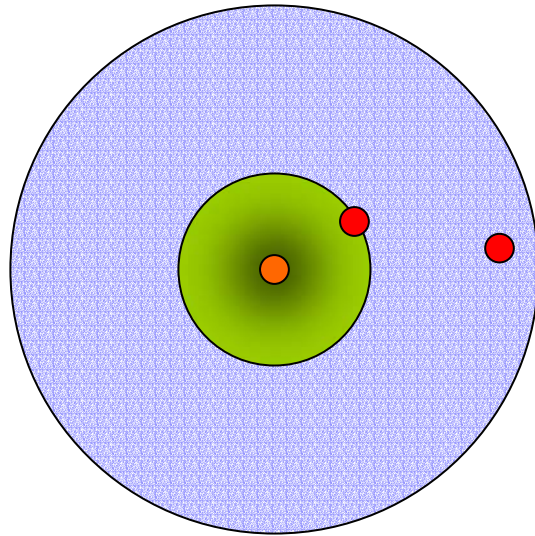
# Inference in the Network

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- Difficulties with traditional inference
- Posterior estimation via particle filters
  - Compute LE posteriors given SENSOR variables
  - Compute CONTAIN posteriors given LE
  - Bound SURROUNDED given CONTAIN

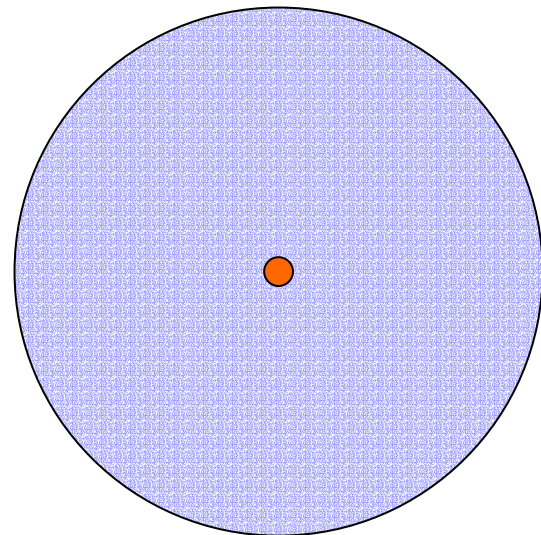


# LE Posterior from SENSOR



Particles in green gain weight;  
other particles unaffected

Particles in blue lose weight →







# Data Association Problem

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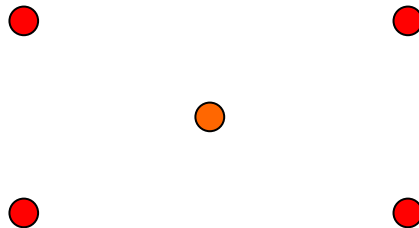
- Impossible to differentiate enemy agents
- Find joint posterior over LE given SENSOR
- Run K-means to use in later inference
- Hard assignment of points to clusters
- Model selection for number of enemies



# CONTAIN Posteriors Given LE

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- Using CCW would yield inaccurate posteriors
- Sample from point clouds of each LE variable
- Count number of times assertion holds
- N-sided polygons often helpful



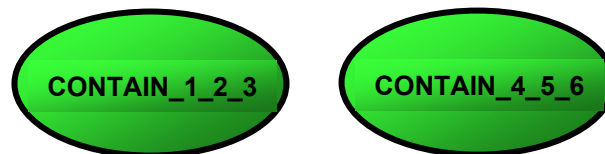


# SURROUNDED Given CONTAIN

- CONTAIN variables generally not independent



- Independent if LE variables used disjoint



- Greedily choose pairwise disjoint variables
- Calculate posterior over chosen sets



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# Intrinsic Difficulty

- Inherently difficult scenarios:
  - When agent is not surrounded
  - When required agents outside sensor range
  - Friendly agent collinear with enemy agents
- Certain configurations confound particle filter
- Simple metric:
  - Inverse of distance to convex hull
  - Infinite if not surrounded



# Sensor Utility Computation

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- Want to maximize sensor utility
- Exact computation
  - Build search tree of sensor choices
  - Choose first sensor of best branch
  - Exponential in number of sensors
- Greedy computation
  - Depth limited search
  - Linear in inference time



# Algorithm RANDOM

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- Chooses sensors randomly
- Repetition of sensors never allowed
- Better than sensing at all sensors



# Algorithm TRIANGLE

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- Uses RANDOM until three affirmative readings
- Build triangles:
  - Two pre-determined enemy agent locations
  - One sensor location as potential agent location
  - Triangle contains friendly agent
- Choose unused sensor with most triangles





# Algorithm ENTROPY

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- Uses RANDOM until three affirmative readings
- Calculate entropy for each expected reading
  - Do calculation for each unused sensor
  - Only affirmative response calculated
- Choose unused sensor with lowest entropy
- Running time linear with number of sensors



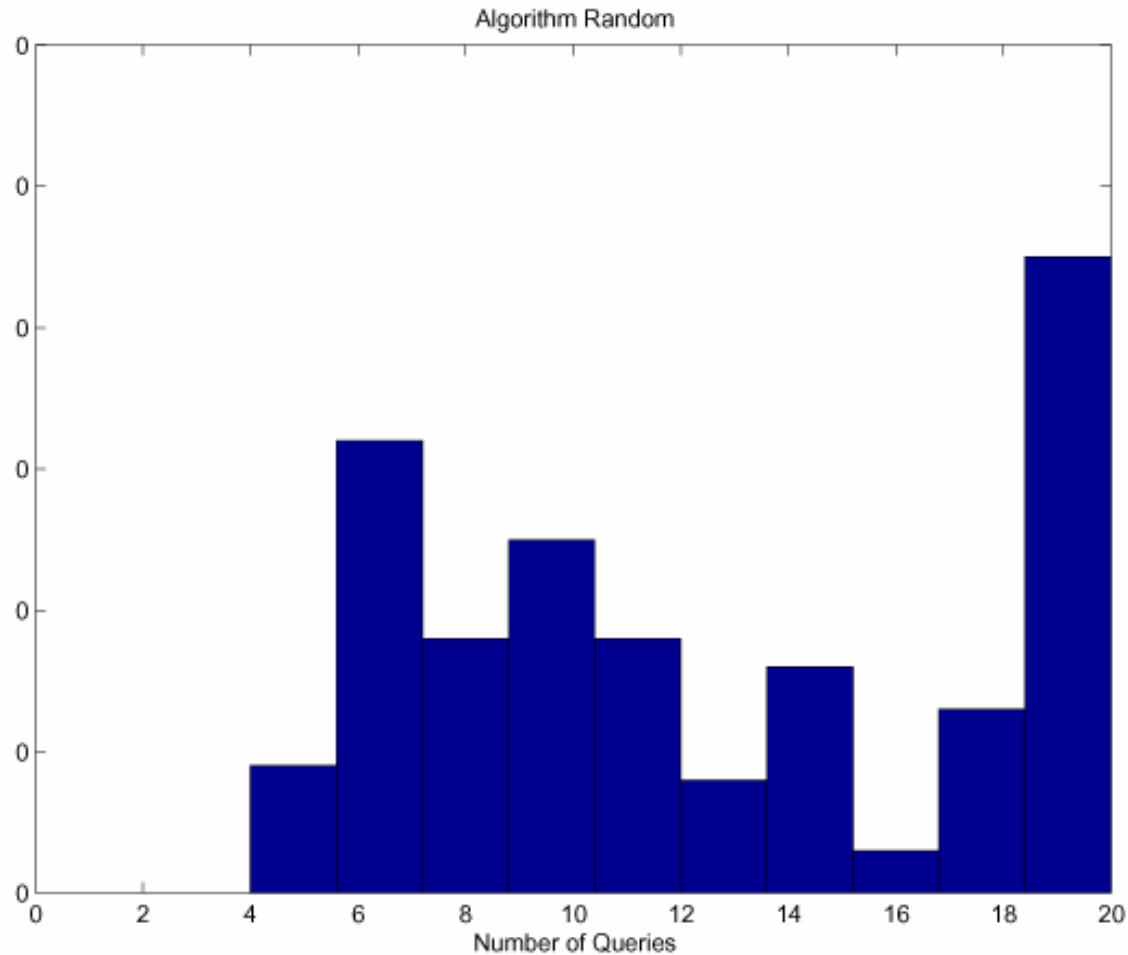
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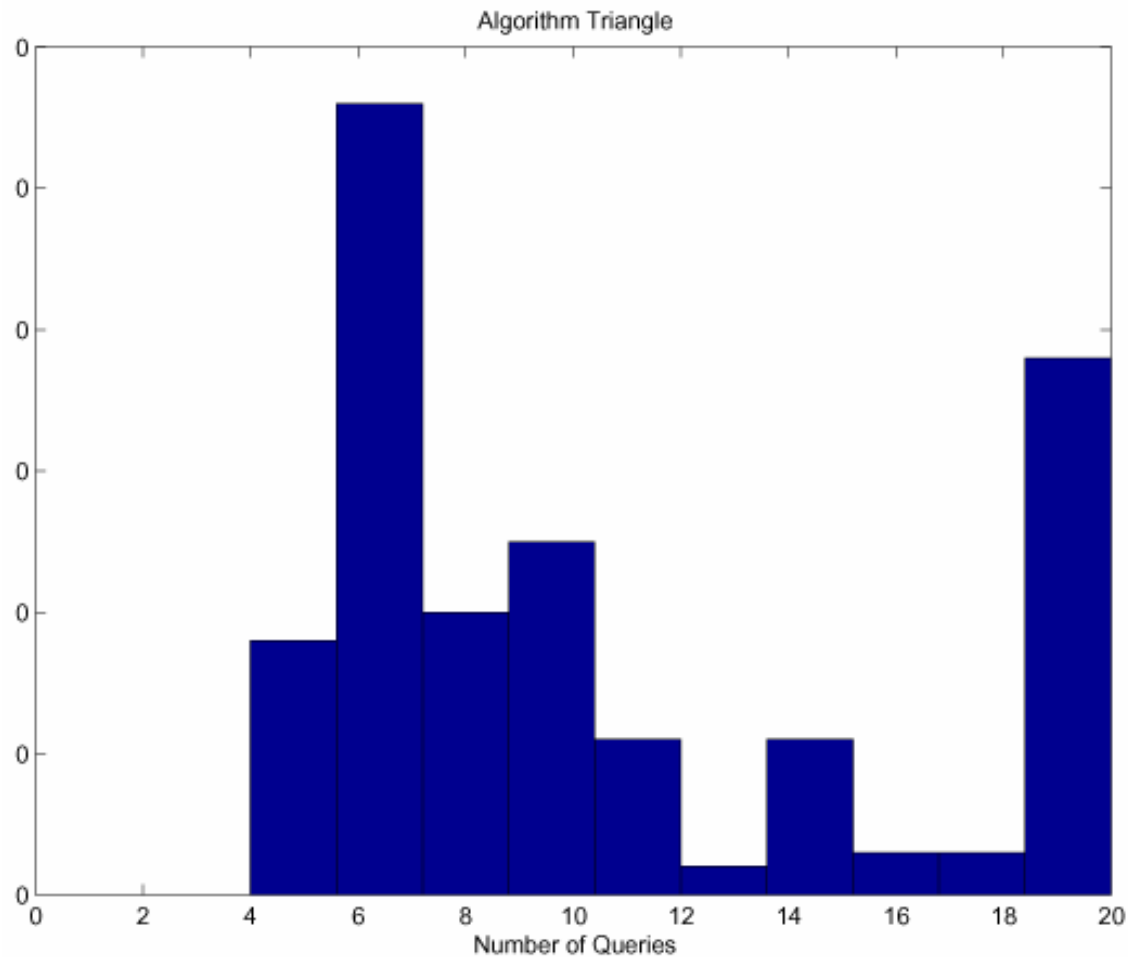


# Algorithm RANDOM



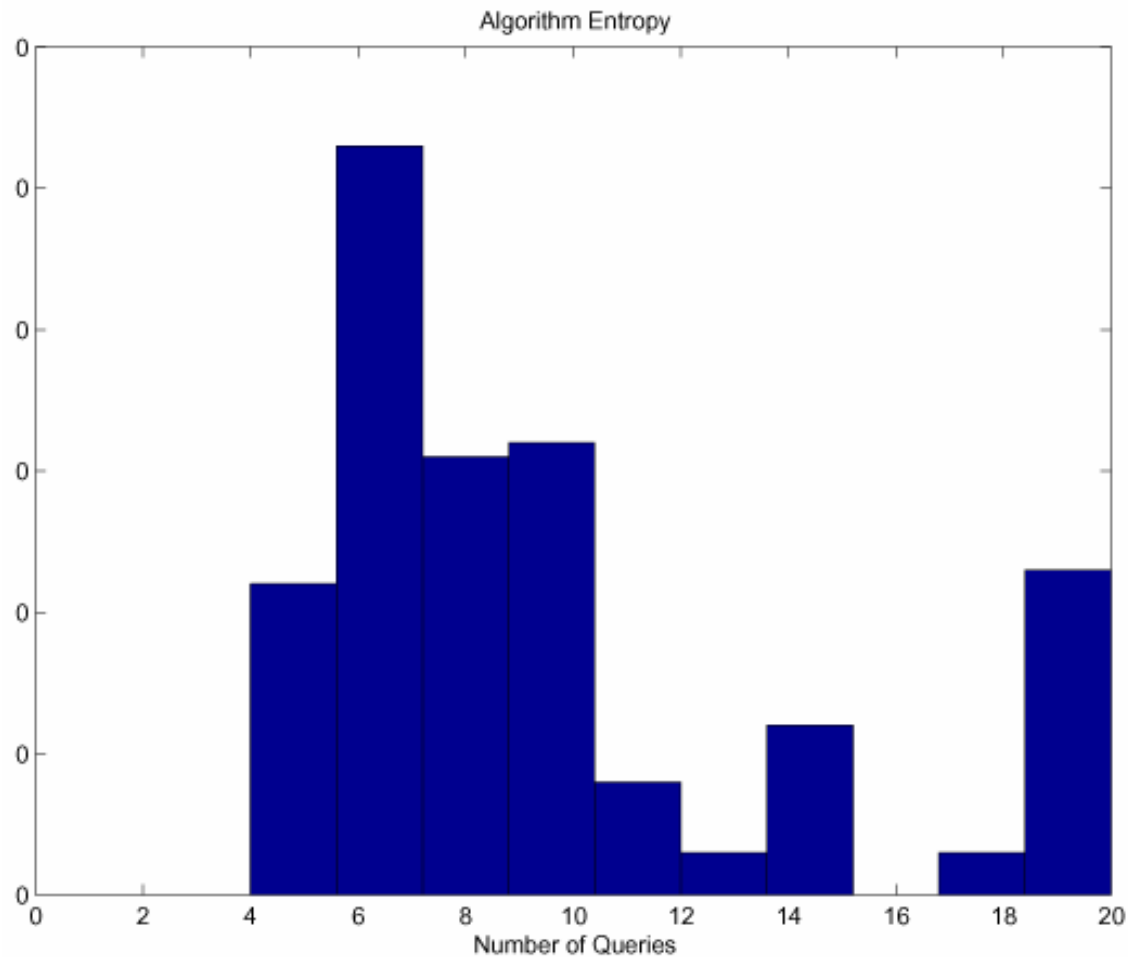


# Algorithm TRIANGLE



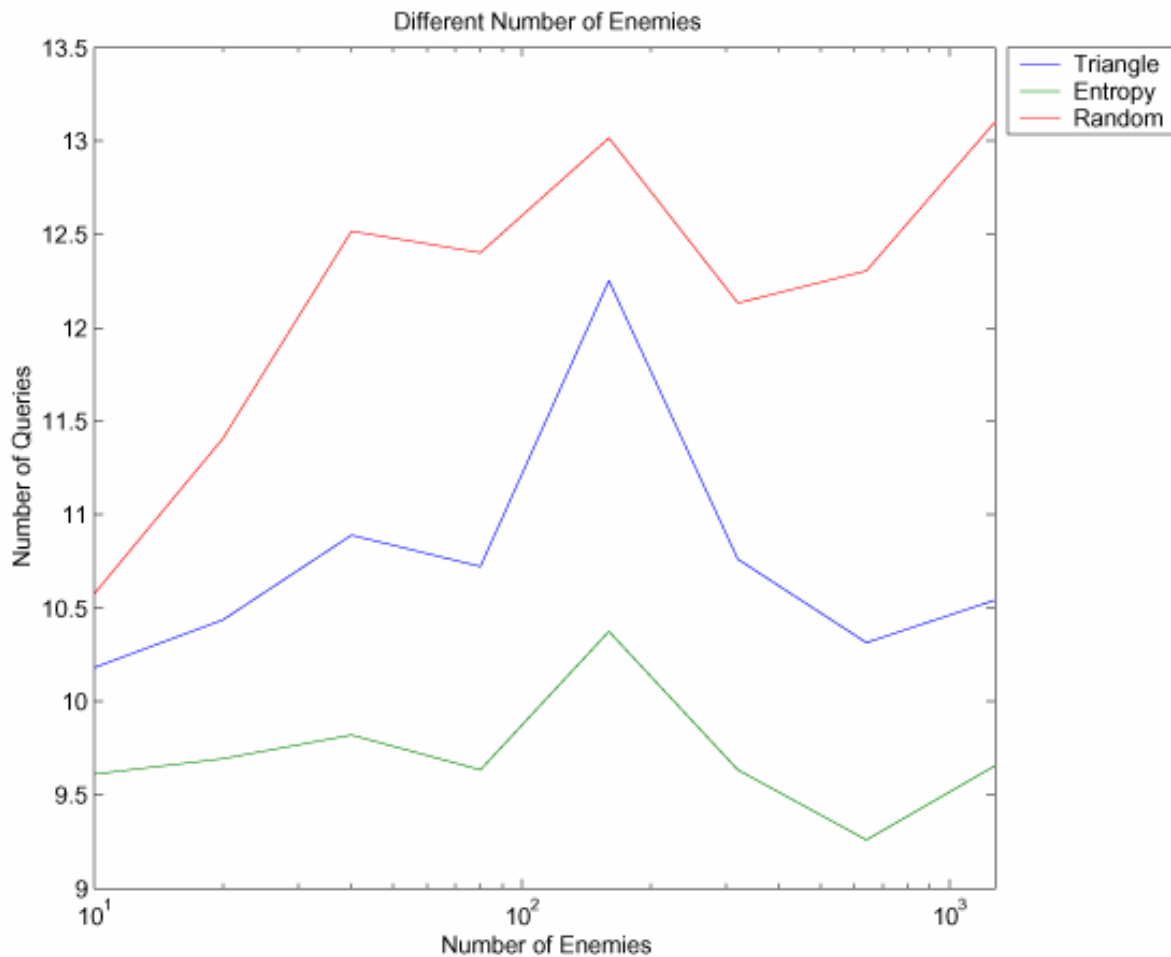


# Algorithm ENTROPY



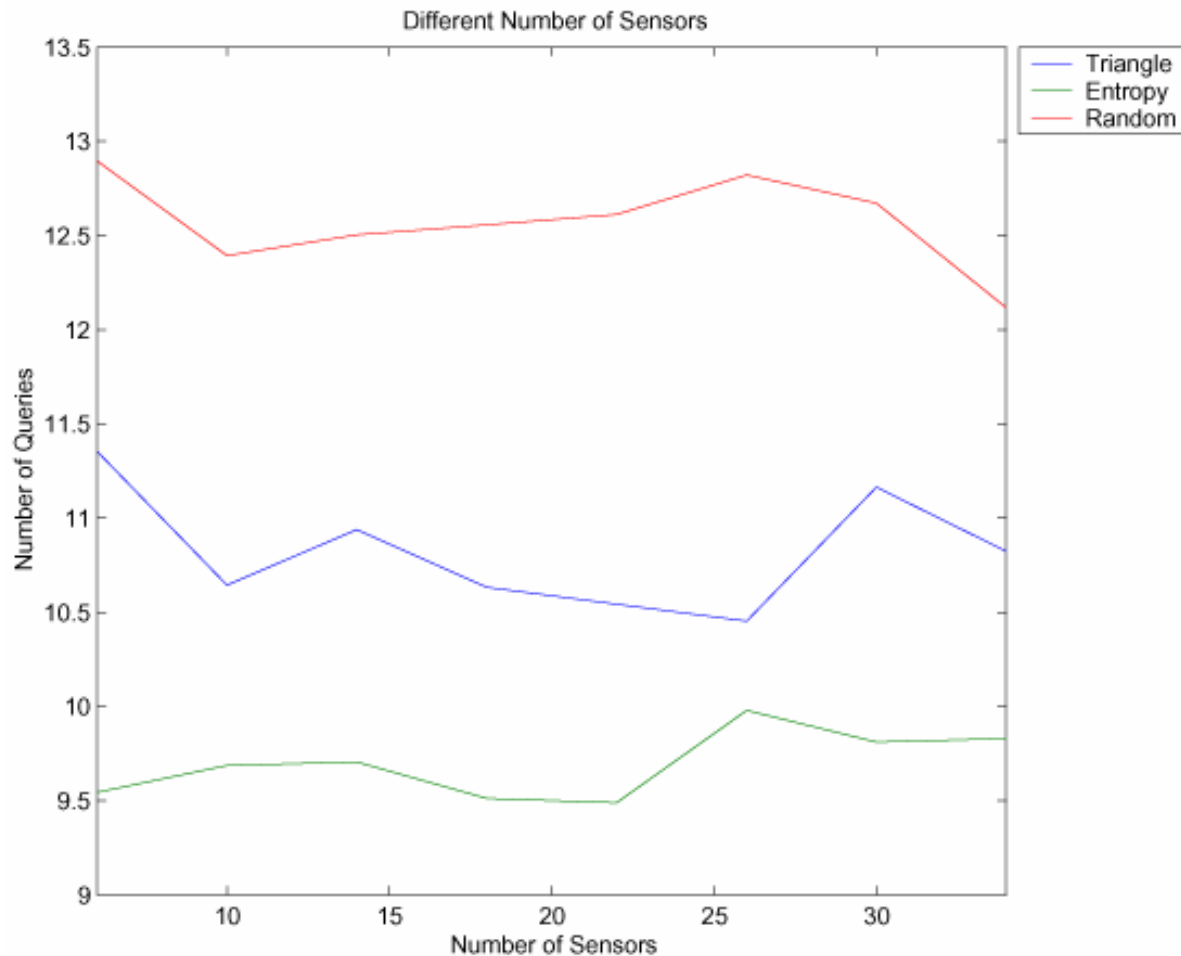


# Varying Number of Enemies



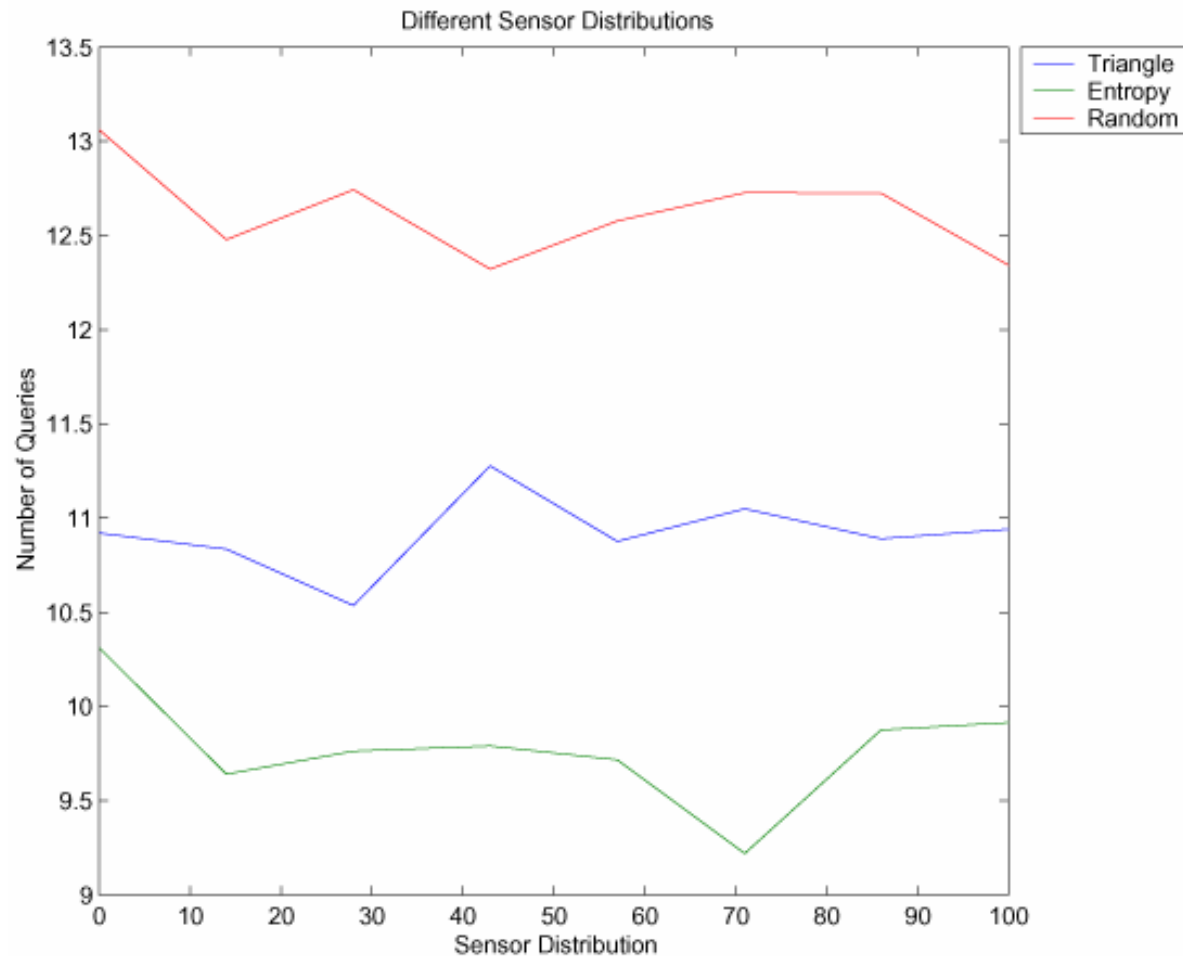


# Varying Number of Sensors





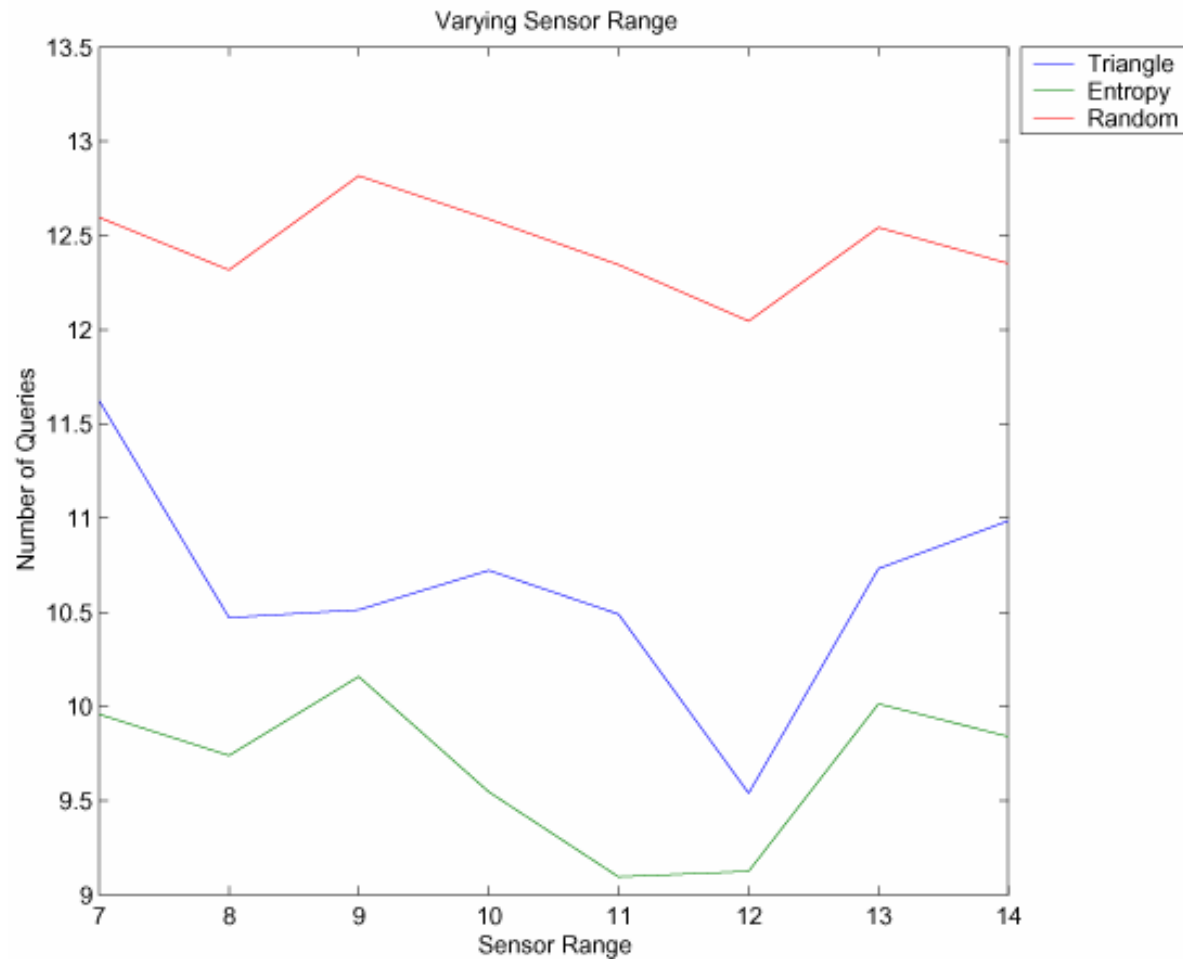
# Varying Sensor Composition







# Varying Field of View





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# Conclusion

- Probabilistic model for Surrounded problem
- Inference technique for calculating posteriors
- Algorithms to choose subsequent sensors