

# Analysis on Perfect Location Spoofing Attacks Using Beamforming

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# Background

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- Location information is critical
  - *Location-based access control*
  - *Identity spoofing detection*
- Threats
  - *Location concealing*
  - *Location spoofing with targeted fake location*
    - **More threatening**

# Road Map

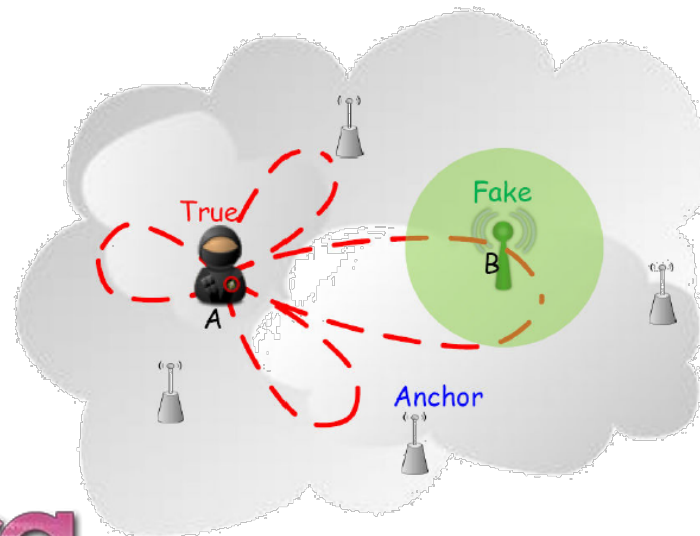
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- Attack Model and Objective
- Problem Formulation
- Algorithm
- Simulation Results
- Conclusion



# Attack Model

- Perfect Location Spoofing (PLS)
  - *Falsify the RSS measurements to be almost the same as for the targeted fake location*
  - *Using carefully designed beamforming pattern*



# Objective

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- By answering the questions below:
  - Is PLS attack possible?
  - Under what situations will PLS be feasible?
- Provide:
  - Suggestions for defending PLS attacks

# Road Map

- *Attack Model and Objective*
- **Problem Formulation**
  - How PLS attack works
  - Requirement of PLS attack
  - PLS feasibility problem
- *Algorithm*
- *Simulation Results*
- *Conclusion*



# Beamforming

- Circular array 
$$G(\theta) = \sum_{i=1}^{N_{ant}} w_i \exp\left[j \frac{2\pi}{\lambda} R \cos(\theta - \phi_i)\right]$$

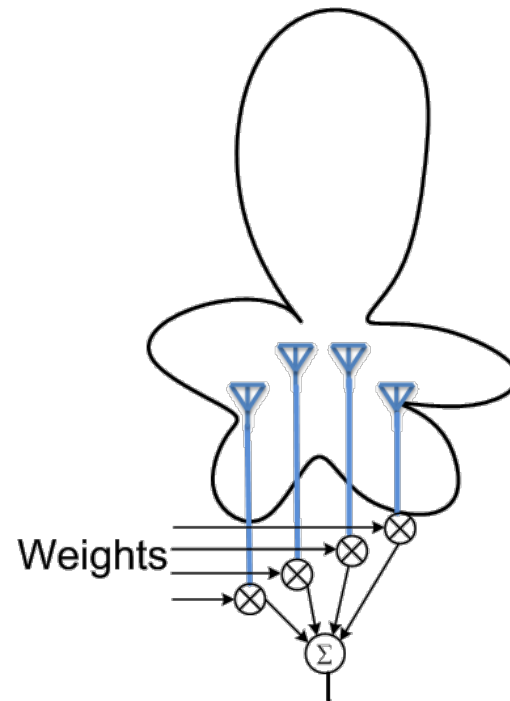
$w_i$  Complex weight

$\frac{2\pi}{\lambda} R \cos(\theta - \phi_i)$  Antenna geometry

Variables to be optimized:

$$\mathbf{w} = [w_1, w_2, \dots, w_{N_{ant}}]^T$$

- Other geometries
  - Linear array
  - Planer array
  - 3-D array



# How PLS attack works

- Compensating path loss differences using beamforming

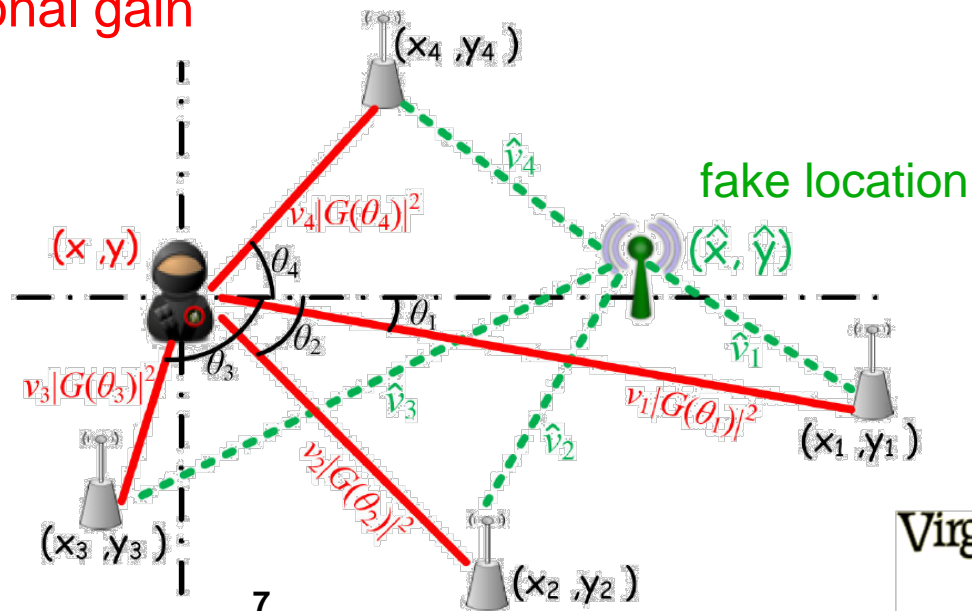
$$v_k |G(\theta_k)|^2 \approx \hat{v}_k, \forall k = 1, 2, \dots, K.$$

Real path loss

Beamforming  
directional gain

Path loss from fake location

- $\theta_k$ : direction of the  $k^{\text{th}}$  anchor





# Requirement of PLS Attack

- For each anchor  $k$  within coverage, the falsified path loss is almost the same as the normal path loss from the fake location, with a difference no more than the standard deviation of Gaussian noise ( $\delta$  dB).

$$|10 \log_{10}(v_k |G(\theta_k)|^2) - 10 \log_{10}(\hat{v}_k)| \leq \delta(\text{dB})$$

$$|G(\theta_k)|^2 = |\mathbf{w}^H \mathbf{h}_k|^2$$

Complex weight vector

Antenna array geometry

# Feasibility Problem of PLS

- NP-hard find any  $\mathbf{w}^H$  ← Complex weighting vector which defines the beamforming pattern  
 s.t.  $|\mathbf{w}^H \mathbf{f}_k|^2 \leq \delta$   
 $|\mathbf{w}^H \mathbf{f}_k|^2 \geq \frac{1}{\delta}$   
 $k = 1, 2, \dots, K.$

$$\mathbf{f}_k = \left( \frac{v_k}{\hat{v}_k} \right)^{\frac{1}{2}} \mathbf{h}_k$$

$$\mathbf{h}_k = \begin{bmatrix} \exp[j \frac{2\pi}{\lambda} R \cos(\theta_k - \phi_1)] \\ \exp[j \frac{2\pi}{\lambda} R \cos(\theta_k - \phi_2)] \\ \vdots \\ \exp[j \frac{2\pi}{\lambda} R \cos(\theta_k - \phi_{N_{ant}})] \end{bmatrix}$$

Antenna array geometry

# Road Map

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# Reformulation

- Add quadratic objective function to the PLS problem:

$$\min_{\mathbf{w}} \quad obj = \sum_{k=1}^K (\text{trace}(\mathbf{X}\mathbf{Q}_k) - 1)^2$$

$$\text{s.t.} \quad \text{trace}(\mathbf{X}\mathbf{Q}_k) \leq \delta$$

$$\text{trace}(\mathbf{X}\mathbf{Q}_k) \geq \frac{1}{\delta}$$

$$k = 1, 2, \dots, K$$

$$\mathbf{X} \succeq 0$$

$$\text{rank}(\mathbf{X}) = 1.$$

Non-convex  
constraint

$$\mathbf{Q}_k = \mathbf{f}_k \mathbf{f}_k^H$$

*obj* reaches 0 when the beamforming pattern is ideal, which means:

$$|\mathbf{w}^H \mathbf{f}_k|^2 = \frac{v_k |G(\theta_k)|^2}{\hat{v}_k} = 1$$

# Semidefinite Relaxation

- Ignore the non-convex constraint “ $\text{rank}(\mathbf{X}) = 1$ ” and we get the following SDR (semidefinite relaxation ) problem, which is convex:

$$\begin{aligned} \min_{\mathbf{w}} \quad & \sum_{k=1}^K (\text{trace}(\mathbf{X}\mathbf{Q}_k) - 1)^2 \\ \text{s.t.} \quad & \text{trace}(\mathbf{X}\mathbf{Q}_k) \leq \delta \\ & \text{trace}(\mathbf{X}\mathbf{Q}_k) \geq \frac{1}{\delta} \\ & k = 1, 2, \dots, K \\ & \mathbf{X} \succeq 0 \end{aligned}$$

# Road Map

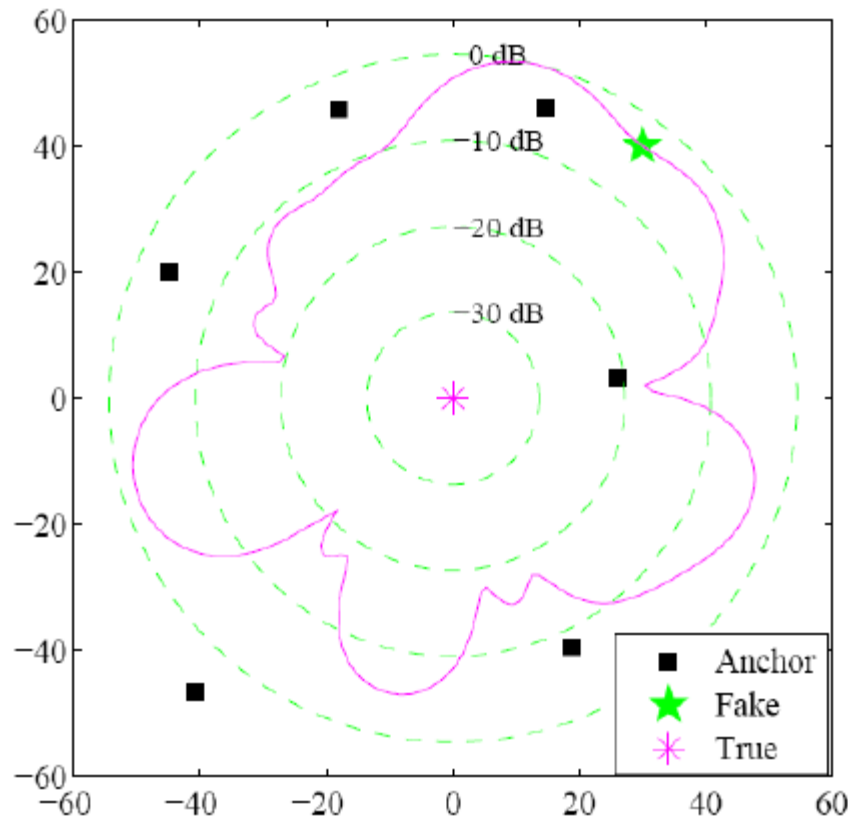
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# PLS Beamforming Pattern

- Anchors are randomly generated in a  $200 \times 200$  m<sup>2</sup> 2-D space
- Attacker's location: (0, 0)
- Fake location: (30, 40)



# Success Rates of PLS

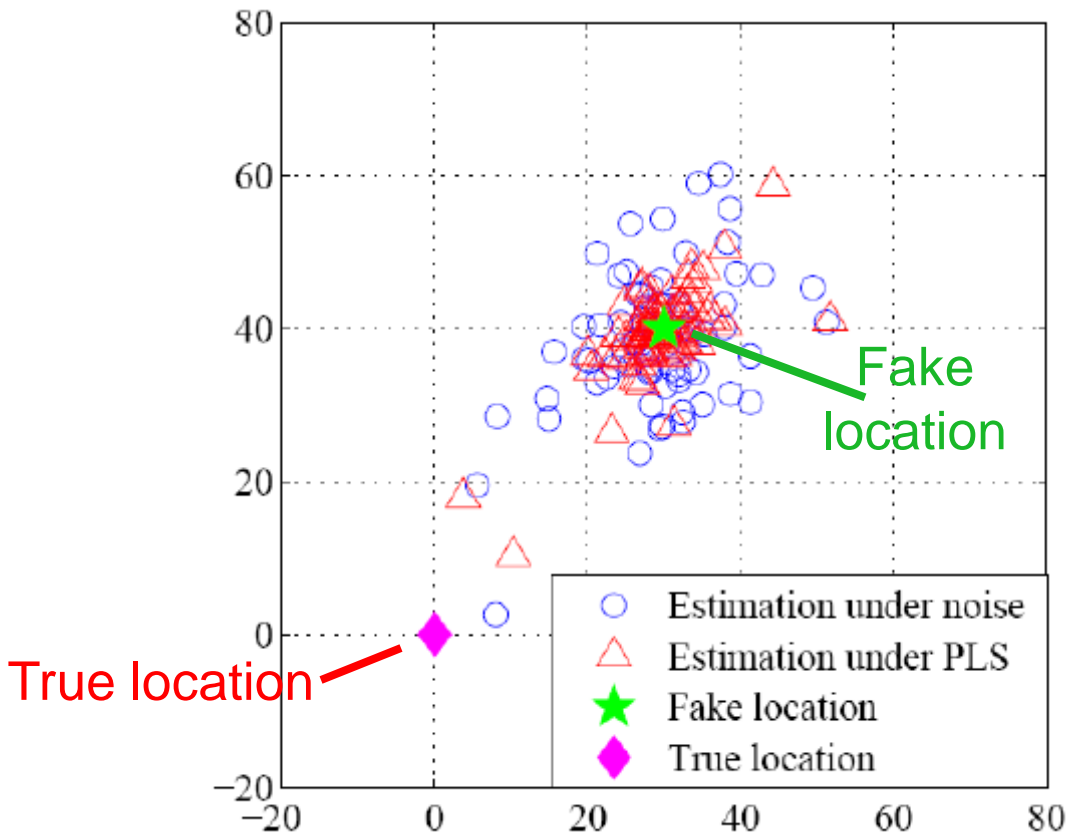
- (# of feasible PLS / # of feasible SDR) out of 200 simulations
  - # of feasible PLS – lower bound
  - # of feasible SDR – upper bound

$\delta$	$K$	$N_{ant}=6$	$N_{ant}=8$	$N_{ant}=10$	$N_{ant}=12$
1dB	4	66/70	142/160	170/181	175/192
	5	4/7	78/97	93/152	106/182
	6	0/0	20/34	43/97	31/162
	7	0/0	0/5	16/64	9/95
	8	0/0	0/0	3/29	1/33
2dB	4	96/96	129/129	171/172	180/181
	5	10/11	105/107	148/148	165/170
	6	0/0	55/56	110/110	134/141
	7	0/0	15/15	81/84	97/107
	8	0/0	1/1	43/50	74/78
3dB	4	80/84	144/145	169/169	186/188
	5	15/16	117/120	148/152	170/176
	6	0/0	60/62	117/120	133/145
	7	0/0	18/20	99/100	100/107
	8	0/0	0/1	44/47	78/86



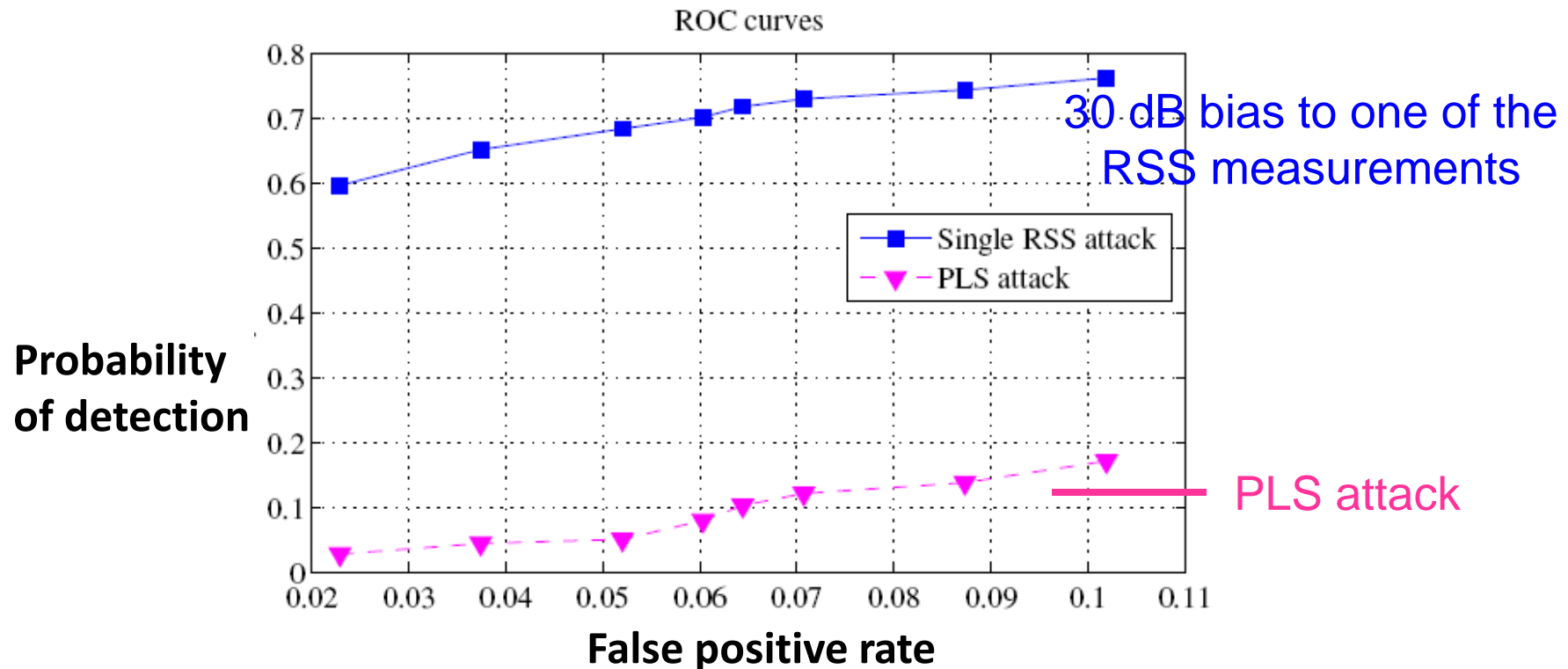


# Spoofer localization



Spoofer location estimations overlapping with noised localization results around the fake location

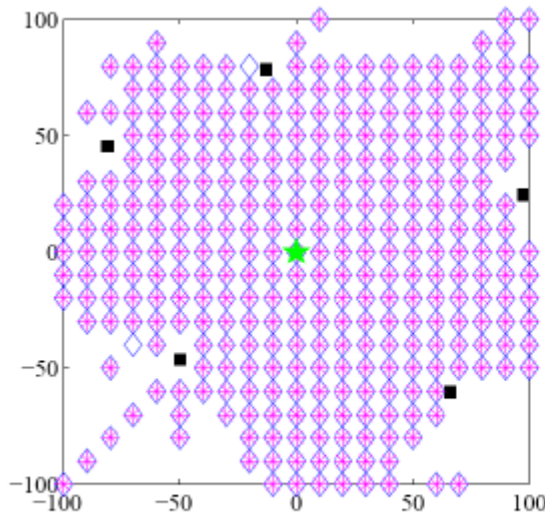
# PLS Attacks are Difficult to Detect



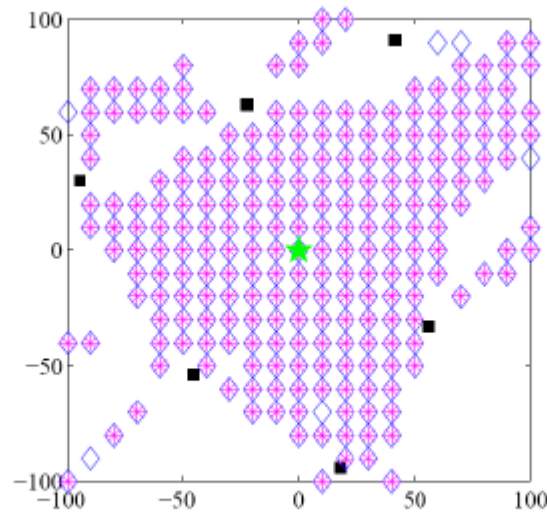
Attack detection algorithm introduced in:

Y. Chen, W. Trappe, and R. P. Martin, "Attack detection in wireless localization," in Proceedings of IEEE INFOCOM, 2007.

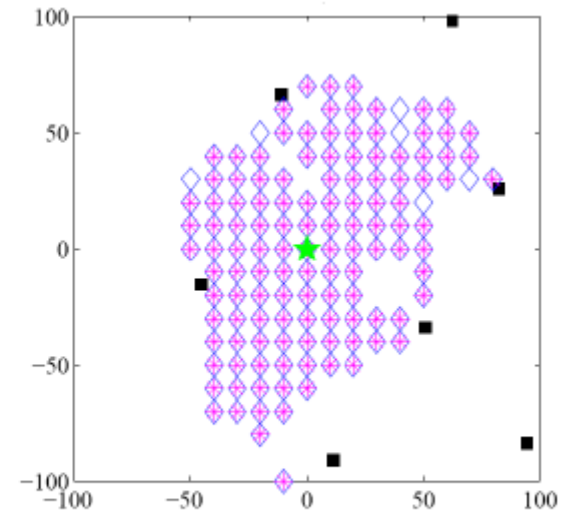
# Fixed Anchor Deployment



(a)  $N_{ant} = 10, K = 5$



(b)  $N_{ant} = 10, K = 6$



(c)  $N_{ant} = 10, K = 7$

■ Anchor    ★ Fake location    ◇ SDR feasible    \* Spoof feasible



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# Conclusion

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- Anchor deployment with higher density lowers the success rate of PLS attacks.
- Guard against PLS attacks
  - Increase anchor density near critical area
  - Use mobile anchors

Thanks!

Questions?

