

# Shooter Localization

Sensor Fusion

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### Purpose

Provide a challenging application on localization in sensor networks.

### Background:

- Goal: Protect a UN camp to snipers.
- Estimation problem: find shooter location and aiming direction.
- Sensor network: Microphones placed around the camp.



Shooter Localization

### Muzzle Blast and Shockwave

A supersonic bullet gives rise to both a shockwave from the bullet (compare to a bow wave from a boat) and a muzzle blast (explosive sound from the gun)

- Red: Bullet trajectory
- Black: Ideal shock wave
- Blue: Shock wave considering bullet retardation
- Magenta: Muzzle blast



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### Sound Detection

- Shockwave comes first for a supersonic bullet
- Triangular waveform caused by the bullet, can be detected as a spike by a high-frequency microphone.
- The muzzle blast has a strong transient, followed by echoes and reverbation effects. The onset time of the transient can be detected from the microphone.



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### Sensor Model

Parameter vector

- Position X, Y of the shooter.
- Aiming angle  $\alpha$ .

• Bullet initial speed  $v_0$  and retardation factor r.

• Shooting time  $t_0$  and sensor clock bias  $b_k$ . Geometry gives the following sensor models:

$$y_k^{\mathsf{mb}} = t_0 + b_k + \frac{1}{c} ||p_k - x|| + e_k^{\mathsf{mb}},$$
  
$$y_k^{\mathsf{sw}} = t_0 + b_k + \frac{1}{r} \log \frac{v_0}{v_0 - r ||d_k - x||} + \frac{1}{c} ||d_k - p_k|| + e_k^{\mathsf{sw}}.$$

where  $d_k$  is an implicit function of the parameters x. The shooting time and clock bias are eliminated by taking the difference  $y_k^{\text{mb}} - y_k^{\text{sw}}$  as the measurement!



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### **NLS Loss Function**

- Field trials with multiple shots from multiple positions.
- Sensor network with ten microphones.
- NLS loss function illustrates the information in  $y_k^{\text{mb}} y_k^{\text{sw}}$ ,  $k = 1, 2, \dots, N = 10$ .



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### **Estimation Results**

- the figure summarizes estimates from multiple shots at multiple positions, every shot is aimed for the same target.
- Both shooter position and aiming direction α are well estimated for each shot.
- In particular, the estimated bullet trajectory passes very close to the target the shooter is aiming for.
- Also bullet's muzzle speed is estimated in the parameters. The ammunition length can be estimated from the sound detection algorithm. From this, important information about the weapon can be deduced.



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## Summary

- Microphone network to estimate position, aiming angle, bullet speed and bullet retardation.
- Signal processing to detect time of arrival of shock wave and muzzle blast.
- Time difference of arrival (TDOA) can with basic geometry be expressed as a function of the parameters.
- NLS based on multiple TDOA measurements gives an estimate of the parameters.
- Field tests resulted in very accurate estimates.
- Collaboration between FOI and LiU.



Section 16.1

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