

On the false alarm probability of the Normalized Matched Filter for off-grid target detection

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Radar Detection Context

The classical Radar detection problem is the following binary Hypothesis Test:

 $\begin{cases} H_0: \mathbf{r} = \mathbf{n} \\ H_1: \mathbf{r} = \alpha \mathbf{d}(\theta) + \mathbf{n} \end{cases}, \text{ where}$

- $\mathbf{r} \in \mathbb{C}^N$ is the observation,
- $\mathbf{d}(\theta) \in \mathbb{C}^N$ is the signal echo reflected by a target with parameters θ (range, angle, Doppler...),
- $\alpha \in \mathbb{C}$ is the complex amplitude of the received signal,
- $\mathbf{n} \in \mathbb{C}^N$ is the additive noise vector, independent of the source signal. Our results hold for any spherically invariant distribution such as $\mathbf{n} \sim \mathcal{CN}(\mathbf{0}, \sigma^2 \mathbf{\Gamma})$.

 $\mathbf{d}(\theta)$: General spectral analysis model (angle or Doppler with Radar):

$$\mathbf{d}(\theta) = \frac{1}{\sqrt{N}} \left[1, e^{2i\pi\theta}, \dots, e^{2i\pi(N-1)\theta} \right]^T.$$

• When the unknown parameters are σ , α under H_1 and σ under H_0 , with θ known, we use the following Normalized Matched Filter (NMF) to decide which hypothesis we are under[1]:

$$t_{\mathbf{\Gamma}}(\mathbf{r},\theta) = \left| \mathbf{s}(\theta)^H \mathbf{u} \right|^2 \underset{H_0}{\overset{H_1}{\gtrless}} \eta.$$

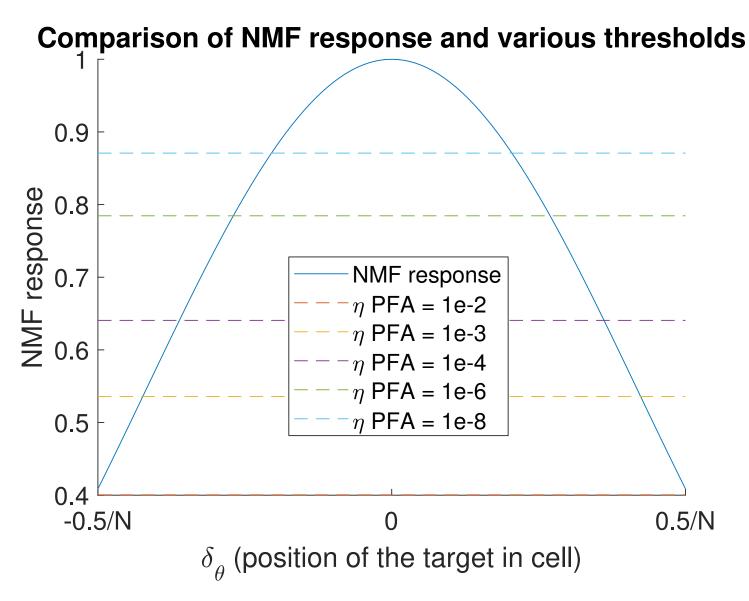
where s and u are the whitened normalized versions of d and r, on \mathbb{S}^{N-1} .

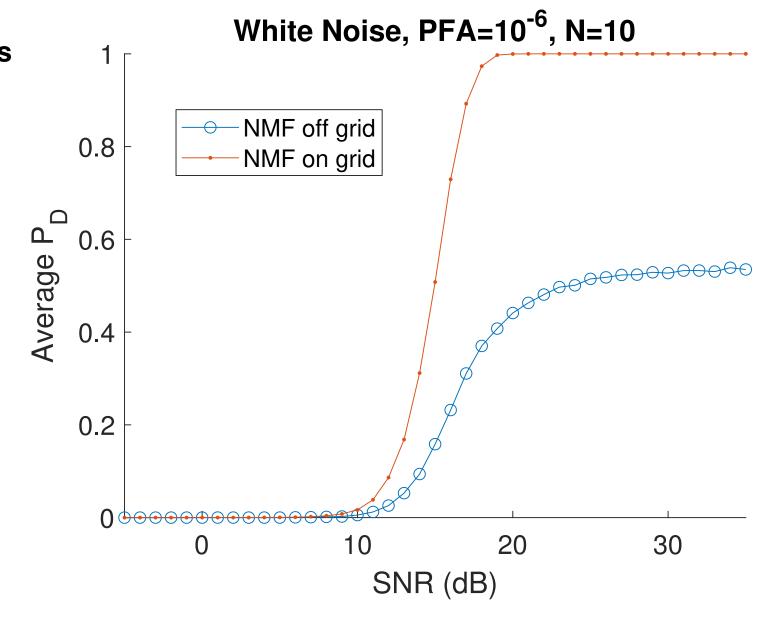
Mismatch And Off-Grid Issue

- The NMF is an angle detector; it is equal to the square of the cosinus of the angle between s and u.
- If there is mismatch between the reference signal $s(\theta_0)$ and target signal $s(\theta)$, the NMF response is degraded even if the power level of the signal is very high [4][5].
- Since the parameter of the target θ is unknown in reality, we usually test for fixed values of θ_0 in a grid G.
- This induces a mismatch that degrades detection performances.
- In order to fight off the mismatch, the optimal known solution is to use the following GLRT detector:

$$GLRT(\mathbf{r}, \mathcal{D}) = \max_{\theta_c \in \mathcal{D}} |\mathbf{s}(\theta_c)^H \mathbf{u}| \underset{H_0}{\overset{H_1}{\gtrless}} w'$$

• We derive its P_{FA} -threshold relationship, unknown in the litterature.





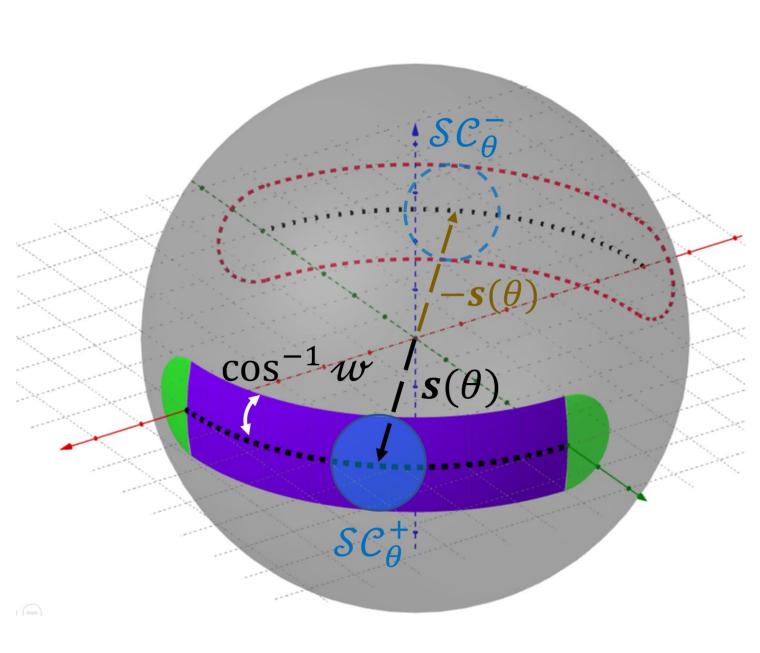
NMF response as a function of the Probability of Detection of the NMF as mismatch with various thresholds a function of SNR in on-grid and off-grid case

Methodology and Result

- To find the P_{FA} , we use a geometrical approach.
- The P_{FA} of the detector is equal to the ratio between the acceptance region and the surface of the unit sphere.
- For real signals, the acceptance region is a tube composed of the spherical caps around $s(\theta_c)$ for each θ_c in the search domain \mathcal{D} . In [2], Hotteling gives a formula for computing the surface of such tubes.
- Our signals are complex and so this result is not applicable. We show our problem reduces to finding the surface of a tube around a 2D manifold. [3] enables us to compute the surface of the tube in our problem.
- We get, under white noise ($\Gamma=\mathbf{I}$):

on-grid relation
$$P_{FA} = \overbrace{(1-w^2)^{N-1}}^{N-1} + \sqrt{\frac{\pi}{3}} \frac{\Gamma(N) \, w \, (1-w^2)^{N-\frac{3}{2}}}{\Gamma\left(N-\frac{1}{2}\right)} \, \left(N^2-1\right)^{\frac{1}{2}} \underbrace{\left(\theta_2-\theta_1\right)}_{\text{length of search domain}}$$

• Under colored noise, we propose an integral that can be computed numerically.



 $0.1 \quad 0.2 \quad 0.3 \quad 0.4 \quad 0.5 \quad 0.6 \quad 0.7 \quad 0.75 \quad 0.8$ threshold w^2

Acceptance zone for real signals

Numerical validation of our result

 P_{FA} -threshold relationship

empirical

theoretical

Numerical Results

- We tested our results under white noise against numerical threshold obtained through Monte Carlo simulations approximating the GLRT with 30 tests per resolution cell.
- It fits perfectly for all P_{FA} of practical interest.
- For really high P_{FA} , the tube overlaps itself and the formula is an upper bound (subject of a future journal article).

Références

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