

# Adaptive and Array Signal Processing

## Homework 07

This problem intends to compare the resolution capabilities of the MUSIC algorithm, MVDR beamformer and classical Fourier based periodogram when applied to an azimuth angle-of-arrival estimation task. We consider a linear array consisting of  $M = 12$  uniformly spaced antenna elements. Three equally powered, uncorrelated, plane wavefronts are impinging at the array. We have  $N = 100$  snapshots available and the Signal-to-Noise ratio is  $\text{SNR} = 10\text{dB}$  (white gaussian noise, uncorrelated with the signals). The transmitted signals are Q-PSK modulated and have unit power, i.e. they take on the four values:

$$\left\{ \frac{1}{\sqrt{2}}(1 + j), \frac{1}{\sqrt{2}}(1 - j), \frac{1}{\sqrt{2}}(-1 + j), \frac{1}{\sqrt{2}}(-1 - j) \right\}.$$

1. Use *MATLAB* or *OCTAVE* to plot the power spectra as a function of the spatial frequency  $\mu$ , normalized to the so called *standard beamwidth*

$$\mu_B = \frac{2\pi}{M}$$

for the following spatial separations

- $\mu_1 = -2\mu_B, \mu_2 = 0, \mu_3 = 2\mu_B$  (two beamwidth separation)
- $\mu_1 = -\mu_B, \mu_2 = 0, \mu_3 = \mu_B$  (one beamwidth separation)
- $\mu_1 = -0.5\mu_B, \mu_2 = 0, \mu_3 = 0.5\mu_B$  (one half beamwidth separation)
- $\mu_1 = -0.1\mu_B, \mu_2 = 0, \mu_3 = 0.1\mu_B$  (one tenth beamwidth separation)

for

- The MVDR spectrum,  $S_{\text{MVDR}}(\mu) = \frac{1}{\mathbf{a}^H(\mu)\mathbf{R}_{xx}^{-1}\mathbf{a}(\mu)}$
- The Fourier spectrum,  $S_{\text{PER}}(\mu) = \frac{1}{N \cdot M^2} \sum_{n=1}^N \left| \sum_{k=0}^{M-1} x_{k+1}(t_n) e^{-j\mu k} \right|^2$
- the MUSIC spectrum,  $S_{\text{MUSIC}}(\mu) = \frac{\mathbf{a}^H(\mu)\mathbf{a}(\mu)}{\mathbf{a}^H(\mu)\mathbf{U}_o\mathbf{U}_o^H\mathbf{a}(\mu)}$

2. Repeat the above problem with an  $\text{SNR} = 20\text{dB}$ .

Hints:

- If the spatial frequencies of the impinging wavefronts are packed into a  $d \times 1$  column vector  $\mu$ , then the array output for  $N$  snapshots can be calculated in MATLAB like

$$\mathbf{X} = \exp(i * ([0:M-1]' * \mu')) * (\text{sign}(\text{randn}(d,N)) + i * \text{sign}(\text{randn}(d,N))) / (\text{sqrt}(2)) + \text{sqrt}(d) * (\text{randn}(M,N) + i * \text{randn}(M,N)) / (\text{sqrt}(2) * 10^{(\text{SNR}/20)});$$

- Plot the power spectra in  $-3\mu_B \leq \mu \leq 3\mu_B$  using about 200 equally spaced points.
- Help on OCTAVE available at: <http://www.gnu.org/software/octave/>

## Homework 07

The main code of the program is the following:

```
clear all

M = 12;
N = 100;
d = 3;
mu_b = 2*pi/M;

figure(1)
title('Two beamwidth separation, SNR=10 dB')
power_spectra(M,N,d,2, mu_b,10);
figure(2)
title('One beamwidth separation, SNR=10 dB')
power_spectra(M,N,d,1, mu_b,10);
figure(3)
title('One half beamwidth separation, SNR=10 dB')
power_spectra(M,N,d,0.5, mu_b,10);
figure(4)
title('One tenth beamwidth separation, SNR=10 dB')
power_spectra(M,N,d,0.1, mu_b,10);
figure(5)
title('Two beamwidth separation, SNR=20 dB')
power_spectra(M,N,d,2, mu_b,20);
figure(6)
title('One beamwidth separation, SNR=20 dB')
power_spectra(M,N,d,1, mu_b,20);
figure(7)
title('One half beamwidth separation, SNR=20 dB')
power_spectra(M,N,d,0.5, mu_b,20);
figure(8)
title('One tenth beamwidth separation, SNR=20 dB')
power_spectra(M,N,d,0.1, mu_b,20);
```

It calls the function called power\_spectra, which is listed below:

```
function power_spectra(M,N,d,b,mu_b,SNR)

mu = [-b*mu_b; 0; b*mu_b];
X = exp(i*([0:M-1]')*mu')*(sign(randn(d,N))+i*sign(randn(d,N)))/(sqrt(2)) +
sqrt(d)*(randn(M,N)+i*randn(M,N))/(sqrt(2)*10^(SNR/20));
Rxx_est = X*X'/N;
[U,D] = SortedEig(Rxx_est);
U0 = U(:,d+1:M);

mu = linspace(-3*mu_b, 3*mu_b, 200)';
k = 0:M-1;
n = 1:N;
for l = 1:length(mu)
    a = exp(i*([0:M-1]')*mu(l));
    S_MVDR(l) = 1/(a'*inv(Rxx_est)*a);
```

```
S_PER(1) = norm(abs(a'*X))^2/(N*M^2);  
S_MUSIC(1) = (norm(a)/norm(a'*U0))^2;  
end  
  
plot(mu, S_MVDR/max(S_MVDR), 'r')  
hold on  
plot(mu, S_PER/max(S_PER), 'g')  
hold on  
plot(mu, S_MUSIC/max(S_MUSIC), 'b')  
legend('MVDR Spectrum', 'Fourier Spectrum', 'MUSIC Spectrum')  
xlabel('Spatial frequency mu')  
ylabel('Normalized to max value power spectrum')
```









