

# **Adaptive strategies comparison for interference suppression in linear arrays**

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## **Abstract**

Dealing with the adaptive nulling of the array radiation pattern, two strategies are investigated in this report. The first one is aimed at maximizing the signal-to-noise-plus-interference ratio whereas the second one is aimed at minimizing the total power received at the output of the array. The performance analysis is proposed in correspondence with a time-varying interference scenario.

# TEST CASE 11 - SINR-max-based Approach - 32 Elements - Time-Varying Scenario

## Goal

Maximization of the SINR using genetic algorithms (GA) to determine the optimal thinned array configuration, considering a time-varying scenario.

## Test Case Description

- Number of Elements  $N = 32$
- Elements Spacing:  $d = 0.5\lambda$
- Max Gain Pattern Direction :  $\theta^d = 90^\circ, \phi^d = 90^\circ$
- Desired Signal Power:  $0 \text{ dB}$
- Interference Power:  $30 \text{ dB}$
- Noise Power:  $-30 \text{ dB}$
- Timesteps:  $T = 900$
- Number of Interferences:  $N_t^I \in [1 - 5]; t = 1, \dots, T$
- Interference Direction Of Arrival:  $\theta_j^i = 90^\circ, \phi_j^i \in [0^\circ - 180^\circ]; j = 1, \dots, N_t^I$

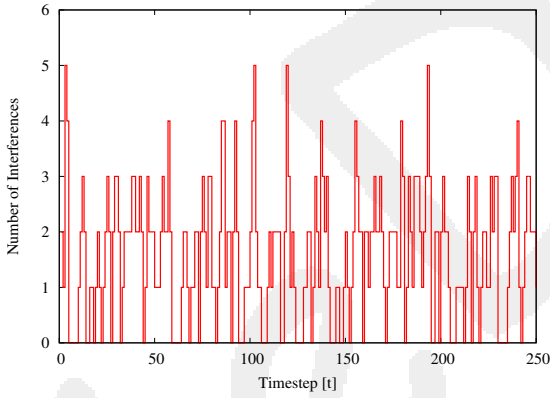


Fig.205 - Number of Interferences

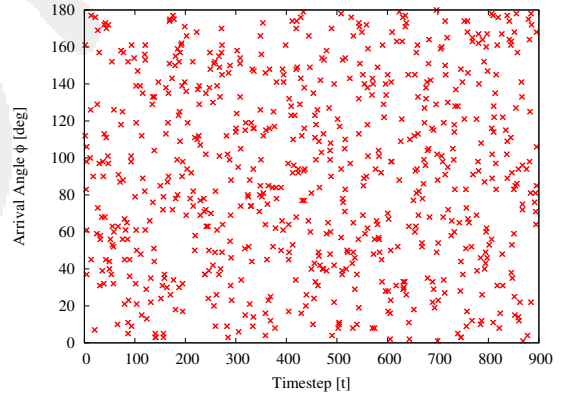


Fig.206 - Arrival Angle

## Optimization Approach: GA

- Number of Variables:  $X = 32$  ( $\alpha_n, n = 1, \dots, N$ )
- Population: 16
- Crossover Probability: 0.9
- Mutation Probability: 0.01
- Number of Generations: 200
- Thinning Coefficient Range:  $\eta \in [0.00 - 1.00], \eta \in [0.40 - 0.80], \eta \in [0.50 - 0.70], \eta \in [0.55 - 0.65], \eta = 0.50, \eta = 0.55, \eta = 0.60, \eta = 0.65$

GA - 32 Elements - Time-Varying Scenario

|                               | $av \{SINR [dB]\}$ | $var \{SINR [dB]\}$ | $min \{SINR [dB]\}$ | $max \{SINR [dB]\}$ |
|-------------------------------|--------------------|---------------------|---------------------|---------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 16.66              | 393.26              | -30.01              | 45.05               |
| $GA - \eta \in [0.40 - 0.80]$ | 17.24              | 392.68              | -30.01              | 43.98               |
| $GA - \eta \in [0.50 - 0.70]$ | 16.62              | 403.00              | -30.02              | 43.42               |
| $GA - \eta \in [0.55 - 0.65]$ | 15.30              | 402.10              | -30.03              | 43.01               |
| $GA - \eta = 0.50$            | 11.24              | 424.60              | -30.07              | 42.04               |
| $GA - \eta = 0.55$            | 10.11              | 446.70              | -30.07              | 42.30               |
| $GA - \eta = 0.60$            | 10.93              | 437.06              | -30.03              | 42.79               |
| $GA - \eta = 0.65$            | 13.41              | 433.55              | -30.03              | 43.01               |

Tab.33 - Statistical analysis of the signal-to-noise-plus-interference-ratio expressed in dB values  $SINR [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

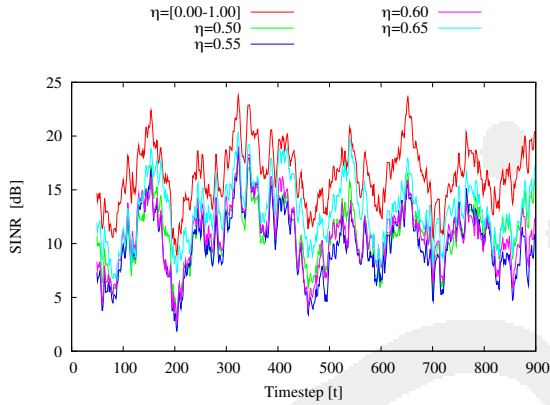


Fig.207 - SINR average comparison

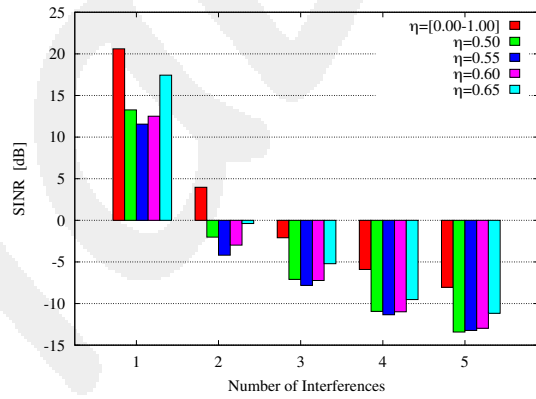


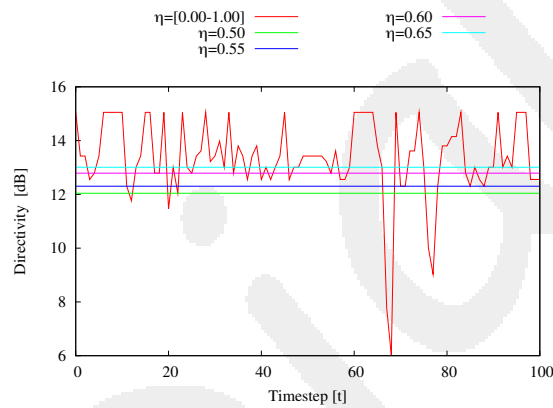
Fig.208 - SINR average comparison

|                               | $av \{N_{ON}\}$ | $var \{N_{ON}\}$ | $min \{N_{ON}\}$ | $max \{N_{ON}\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 22.45           | 39.28            | 4                | 32               |
| $GA - \eta \in [0.40 - 0.80]$ | 20.82           | 12.33            | 12               | 25               |
| $GA - \eta \in [0.50 - 0.70]$ | 20.15           | 3.52             | 16               | 22               |
| $GA - \eta \in [0.55 - 0.65]$ | 18.95           | 1.33             | 17               | 20               |
| $GA - \eta = 0.50$            | 16              | 0                | 16               | 16               |
| $GA - \eta = 0.55$            | 17              | 0                | 17               | 17               |
| $GA - \eta = 0.60$            | 19              | 0                | 19               | 19               |
| $GA - \eta = 0.65$            | 20              | 0                | 20               | 20               |

Tab.34 - Statistical analysis of the number of active elements  $N_{ON}$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

|                               | $av \{D [dB]\}$ | $var \{D [dB]\}$ | $min \{D [dB]\}$ | $max \{D [dB]\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 13.32           | 1.79             | 6.02             | 15.05            |
| $GA - \eta \in [0.40 - 0.80]$ | 13.12           | 0.64             | 10.79            | 13.98            |
| $GA - \eta \in [0.50 - 0.70]$ | 13.02           | 0.18             | 12.04            | 13.42            |
| $GA - \eta \in [0.55 - 0.65]$ | 12.77           | 0.07             | 12.30            | 13.01            |
| $GA - \eta = 0.50$            | 12.04           | 0                | 12.04            | 12.04            |
| $GA - \eta = 0.55$            | 12.30           | 0                | 12.30            | 12.30            |
| $GA - \eta = 0.60$            | 12.79           | 0                | 12.79            | 12.79            |
| $GA - \eta = 0.65$            | 13.01           | 0                | 13.01            | 13.01            |

**Tab.35 - Statistical analysis of the directivity  $D [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**



**Fig.209 - Directivity comparison**

**Observations:**

- Fig.207 riporta l'andamento medio del  $SINR$  in  $dB$  mediato sui 50 timesteps precedenti;
- Fig.208 riporta il valore medio del  $SINR$  in  $dB$  calcolato distinguendo i timesteps con 1,2,3,4, e 5 interferenze;
- Le prestazioni della tecnica sono buone anche per casi constrained: il valore del  $SINR$  medio risulta sempre superiore ai  $10dB$ ;

# TEST CASE 12 - SINR-max-based - 64 Elements - Time-Varying Scenario

## Goal

Maximization of the SINR using genetic algorithms (GA) to determine the optimal thinned array configuration, considering a time-varying scenario.

## Test Case Description

- Number of Elements  $N = 64$
- Elements Spacing:  $d = 0.5\lambda$
- Max Gain Pattern Direction :  $\theta^d = 90^\circ, \phi^d = 90^\circ$
- Desired Signal Power:  $0 \text{ dB}$
- Interference Power:  $30 \text{ dB}$
- Noise Power:  $-30 \text{ dB}$
- Timesteps:  $T = 900$
- Number of Interferences:  $N_t^I \in [1 - 5] \quad t = 1, \dots, T$
- Interference Direction Of Arrival:  $\theta_j^i = 90^\circ, \phi_j^i = 42^\circ$

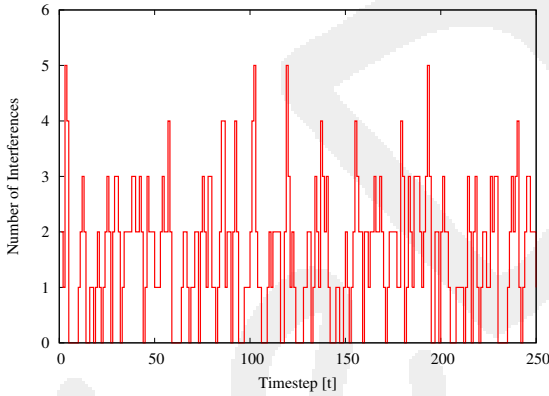


Fig.210 - Number of Interferences

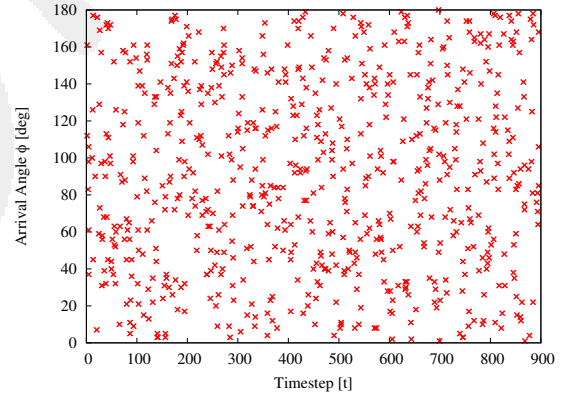


Fig.211 - Arrival Angle

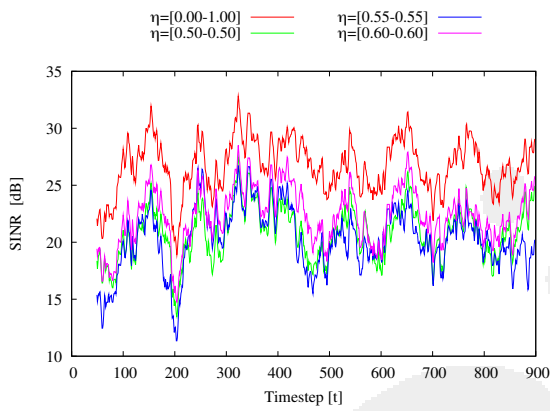
## Optimization Approach: GA

- Number of Variables:  $X = 64$  ( $\alpha_n, n = 1, \dots, N$ )
- Population: 32
- Crossover Probability: 0.9
- Mutation Probability: 0.01
- Number of Generations: 200
- Thinning Coefficient Range:  $\eta \in [0.00 - 1.00], \eta \in [0.40 - 0.80], \eta \in [0.50 - 0.70], \eta \in [0.55 - 0.65], \eta = 0.50, \eta = 0.55, \eta = 0.60$

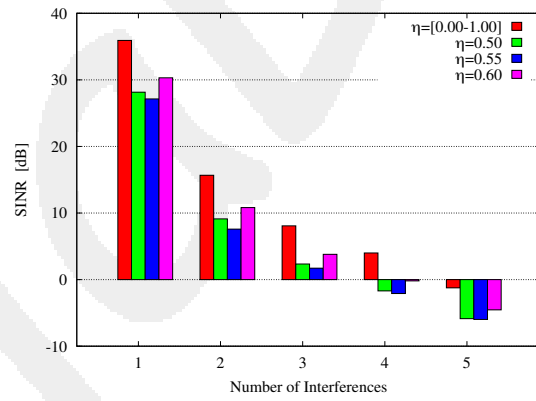
## GA - 64 Elements - Time-Varying Scenario

|                               | $av \{SINR [dB]\}$ | $var \{SINR [dB]\}$ | $min \{SINR [dB]\}$ | $max \{SINR [dB]\}$ |
|-------------------------------|--------------------|---------------------|---------------------|---------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 26.80              | 308.50              | -30.00              | 48.06               |
| $GA - \eta \in [0.40 - 0.80]$ | 26.20              | 307.21              | -30.00              | 47.08               |
| $GA - \eta \in [0.50 - 0.70]$ | 25.43              | 312.29              | -30.00              | 46.43               |
| $GA - \eta \in [0.55 - 0.65]$ | 25.34              | 314.51              | -30.00              | 46.13               |
| $GA - \eta = 0.50$            | 20.98              | 335.61              | -30.00              | 45.05               |
| $GA - \eta = 0.55$            | 20.26              | 360.73              | -30.00              | 45.44               |
| $GA - \eta = 0.60$            | 22.52              | 337.94              | -30.00              | 45.80               |

**Tab.36 - Statistical analysis of the signal-to-noise-plus-interference-ratio expressed in dB values**  
 $SINR [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .



**Fig.212 - SINR average comparison**



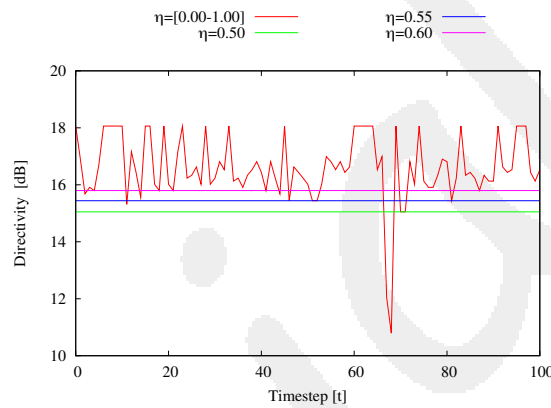
**Fig.213 - SINR average comparison**

|                               | $av \{N_{ON}\}$ | $var \{N_{ON}\}$ | $min \{N_{ON}\}$ | $max \{N_{ON}\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 47.18           | 114.85           | 12               | 64               |
| $GA - \eta \in [0.40 - 0.80]$ | 44.50           | 29.21            | 25               | 51               |
| $GA - \eta \in [0.50 - 0.70]$ | 40.64           | 9.27             | 32               | 44               |
| $GA - \eta \in [0.55 - 0.65]$ | 38.92           | 3.32             | 35               | 41               |
| $GA - \eta = 0.50$            | 32              | 0                | 32               | 32               |
| $GA - \eta = 0.55$            | 35              | 0                | 35               | 35               |
| $GA - \eta = 0.60$            | 38              | 0                | 38               | 38               |

**Tab.37 - Statistical analysis of the number of active elements  $N_{ON}$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**

|                               | $av \{D [dB]\}$ | $var \{D [dB]\}$ | $min \{D [dB]\}$ | $max \{D [dB]\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 16.62           | 1.10             | 10.79            | 18.06            |
| $GA - \eta \in [0.40 - 0.80]$ | 16.45           | 0.33             | 13.98            | 17.08            |
| $GA - \eta \in [0.50 - 0.70]$ | 16.08           | 0.11             | 15.05            | 16.43            |
| $GA - \eta \in [0.55 - 0.65]$ | 15.90           | 0.04             | 15.44            | 16.13            |
| $GA - \eta = 0.50$            | 15.05           | 0                | 15.05            | 15.05            |
| $GA - \eta = 0.55$            | 15.44           | 0                | 15.44            | 15.44            |
| $GA - \eta = 0.60$            | 15.80           | 0                | 15.80            | 15.80            |

**Tab.38 - Statistical analysis of the directivity  $D [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**



**Fig.214 - Directivity comparison**

**Observations:**

- Fig.212 riporta l'andamento medio del  $SINR$  in  $dB$  mediato sui 50 timesteps precedenti;
- Fig.213 riporta il valore medio del  $SINR$  in  $dB$  calcolato distinguendo i timesteps con 1,2,3,4, e 5 interferenze;
- Le prestazioni della tecnica sono buone anche per casi constrained: il valore del  $SINR$  medio risulta sempre superiore ai  $20dB$ ;

# TEST CASE 13 - SINR-max-based - 128 Elements - Time-Varying Scenario

## Goal

Maximization of the SINR using genetic algorithms (GA) to determine the optimal thinned array configuration, considering a time-varying scenario.

## Test Case Description

- Number of Elements  $N = 128$
- Elements Spacing:  $d = 0.5\lambda$
- Max Gain Pattern Direction :  $\theta^d = 90^\circ, \phi^d = 90^\circ$
- Desired Signal Power:  $0 \text{ dB}$
- Interference Power:  $30 \text{ dB}$
- Noise Power:  $-30 \text{ dB}$
- Timesteps:  $T = 900$
- Number of Interferences:  $N_t^I \in [1 - 5]; t = 1, \dots, T$
- Interference Direction Of Arrival:  $\theta_j^i = 90^\circ, \phi_j^i \in [0^\circ - 180^\circ]; j = 1, \dots, N_t^I$

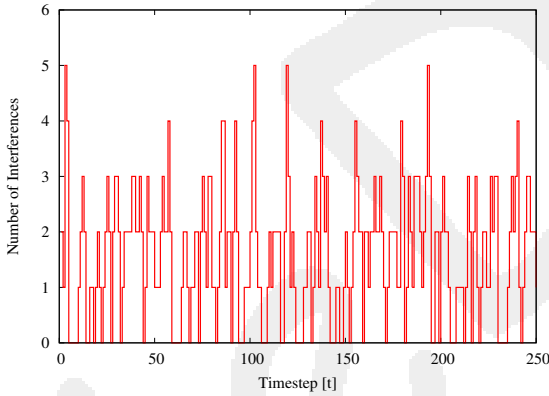


Fig.215 - Number of Interferences

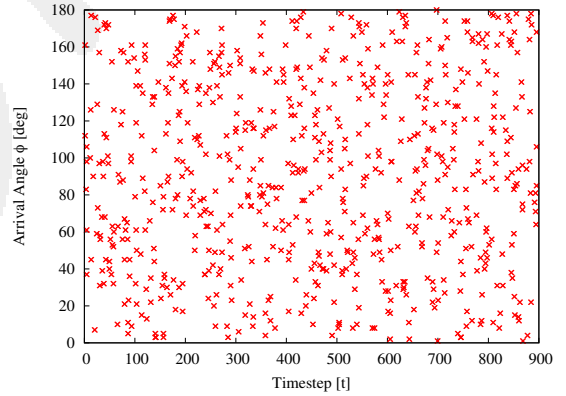


Fig.216 - Arrival Angle

## Optimization Approach: GA

- Number of Variables:  $X = 128 (\alpha_n, n = 1, \dots, N)$
- Population: 64
- Crossover Probability: 0.9
- Mutation Probability: 0.01
- Number of Generations: 200
- Thinning Coefficient Range:  $\eta \in [0.00 - 1.00], \eta \in [0.40 - 0.80], \eta \in [0.50 - 0.70], \eta \in [0.55 - 0.65], \eta = 0.50, \eta = 0.55, \eta = 0.60$



GA - 128 Elements - Time-Varying Scenario

|                               | $av \{SINR [dB]\}$ | $var \{SINR [dB]\}$ | $min \{SINR [dB]\}$ | $max \{SINR [dB]\}$ |
|-------------------------------|--------------------|---------------------|---------------------|---------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 29.73              | 322.26              | -30.00              | 51.07               |
| $GA - \eta \in [0.40 - 0.80]$ | 29.67              | 309.42              | -30.00              | 50.09               |
| $GA - \eta \in [0.50 - 0.70]$ | 29.46              | 305.78              | -30.00              | 49.49               |
| $GA - \eta \in [0.55 - 0.65]$ | 29.41              | 301.62              | -30.00              | 49.19               |
| $GA - \eta = 0.50$            | 30.38              | 275.39              | -30.00              | 48.06               |
| $GA - \eta = 0.55$            | 31.12              | 283.91              | -30.00              | 48.45               |
| $GA - \eta = 0.60$            | 31.63              | 270.89              | -30.00              | 48.81               |

Tab.39 - Statistical analysis of the signal-to-noise-plus-interference-ratio expressed in dB values  
 $SINR [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

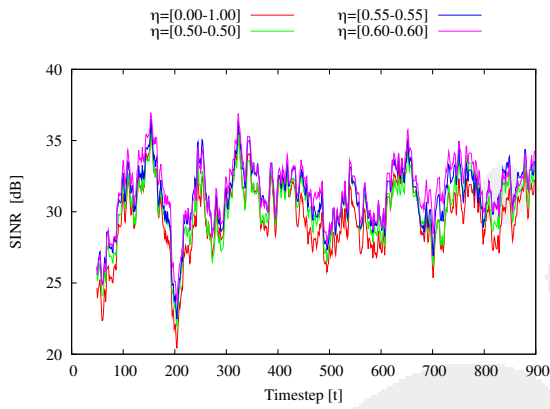


Fig.217 - SINR average comparison

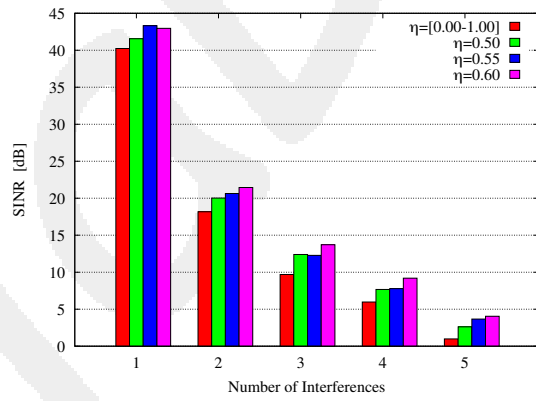


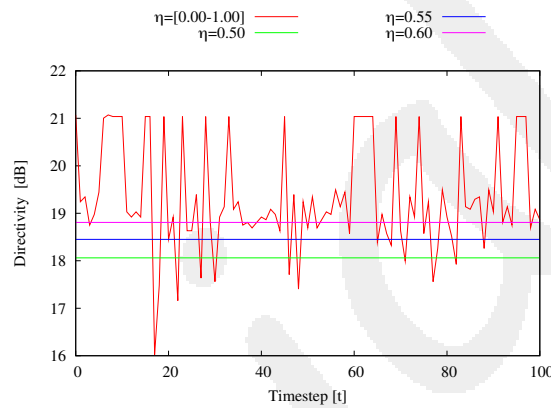
Fig.218 - SINR average comparison

|                               | $av \{N_{ON}\}$ | $var \{N_{ON}\}$ | $min \{N_{ON}\}$ | $max \{N_{ON}\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 88.61           | 542.72           | 21               | 128              |
| $GA - \eta \in [0.40 - 0.80]$ | 85.26           | 129.58           | 52               | 102              |
| $GA - \eta \in [0.50 - 0.70]$ | 81.57           | 34.84            | 64               | 89               |
| $GA - \eta \in [0.55 - 0.65]$ | 78.19           | 14.61            | 70               | 83               |
| $GA - \eta = 0.50$            | 64              | 0                | 64               | 64               |
| $GA - \eta = 0.55$            | 70              | 0                | 70               | 70               |
| $GA - \eta = 0.60$            | 76              | 0                | 76               | 76               |

Tab.40 - Statistical analysis of the number of active elements  $N_{ON}$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

|                               | $av \{D [dB]\}$ | $var \{D [dB]\}$      | $min \{D [dB]\}$ | $max \{D [dB]\}$ |
|-------------------------------|-----------------|-----------------------|------------------|------------------|
| $GA - \eta \in [0.00 - 1.00]$ | 19.33           | 1.21                  | 13.22            | 21.07            |
| $GA - \eta \in [0.40 - 0.80]$ | 19.27           | 0.34                  | 17.16            | 20.09            |
| $GA - \eta \in [0.50 - 0.70]$ | 19.10           | 0.10                  | 18.06            | 19.49            |
| $GA - \eta \in [0.55 - 0.65]$ | 18.45           | $4.56 \times 10^{-2}$ | 18.93            | 19.19            |
| $GA - \eta = 0.50$            | 18.06           | 0                     | 18.06            | 18.06            |
| $GA - \eta = 0.55$            | 18.45           | 0                     | 18.45            | 18.45            |
| $GA - \eta = 0.60$            | 18.81           | 0                     | 18.81            | 18.81            |

**Tab.41 - Statistical analysis of the directivity  $D [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**



**Fig.219 - Directivity comparison**

**Observations:**

- Fig.217 riporta l'andamento medio del  $SINR$  in  $dB$  mediato sui 50 timesteps precedenti;
- Fig.218 riporta il valore medio del  $SINR$  in  $dB$  calcolato distinguendo i timesteps con 1,2,3,4, e 5 interferenze;
- Le prestazioni della tecnica sono buone anche per casi constrained: il valore del  $SINR$  medio risulta sempre circa uguale a  $30dB$ ;

# TEST CASE 14 - MinPwr Approach - 32 Elements - Time-Varying Scenario

## Goal

Maximization of the SINR using genetic algorithms (GA) to determine the optimal thinned array configuration, considering a time-varying scenario.

## Test Case Description

- Number of Elements  $N = 32$
- Elements Spacing:  $d = 0.5\lambda$
- Max Gain Pattern Direction :  $\theta^d = 90^\circ, \phi^d = 90^\circ$
- Desired Signal Power:  $0 \text{ dB}$
- Interference Power:  $30 \text{ dB}$
- Noise Power:  $-30 \text{ dB}$
- Timesteps:  $T = 900$
- Number of Interferences:  $N_t^I \in [1 - 5]; t = 1, \dots, T$
- Interference Direction Of Arrival:  $\theta_j^i = 90^\circ, \phi_j^i \in [0^\circ - 180^\circ]; j = 1, \dots, N_t^I$

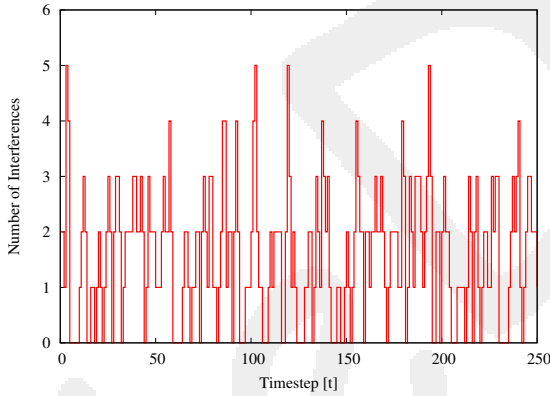


Fig.220 - Number of Interferences

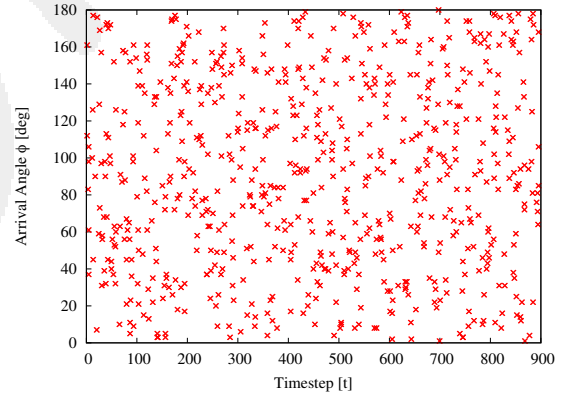


Fig.221 - Arrival Angle

## Optimization Approach: GA

- Number of Variables:  $X = 32 (\alpha_n, n = 1, \dots, N)$
- Population: 16
- Crossover Probability: 0.9
- Mutation Probability: 0.01
- Number of Generations: 200
- Thinning Coefficient Range:  $\eta \in [0.40 - 0.80], \eta \in [0.50 - 0.70], \eta \in [0.55 - 0.65], \eta = 0.50, \eta = 0.55, \eta = 0.60, \eta = 0.65$

GA - minPwr Approach - 32 Elements - Time-Varying Scenario

|                               | $av \{SINR [dB]\}$ | $var \{SINR [dB]\}$ | $min \{SINR [dB]\}$ | $max \{SINR [dB]\}$ |
|-------------------------------|--------------------|---------------------|---------------------|---------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 12.90              | 372.35              | -30.06              | 40.79               |
| $GA - \eta \in [0.50 - 0.70]$ | 13.81              | 374.44              | -30.02              | 42.04               |
| $GA - \eta \in [0.55 - 0.65]$ | 13.84              | 377.14              | -30.06              | 42.55               |
| $GA - \eta = 0.50$            | 11.24              | 424.60              | -30.07              | 42.04               |
| $GA - \eta = 0.55$            | 10.11              | 446.70              | -30.07              | 42.30               |
| $GA - \eta = 0.60$            | 10.93              | 437.06              | -30.03              | 42.79               |
| $GA - \eta = 0.65$            | 13.41              | 433.55              | -30.03              | 43.01               |

Tab.42 - Statistical analysis of the signal-to-noise-plus-interference-ratio expressed in dB values  $SINR [dB]$ : average  $av \{ \cdot \}$ , variance  $var \{ \cdot \}$ , minimum  $min \{ \cdot \}$  and maximum  $max \{ \cdot \}$ .

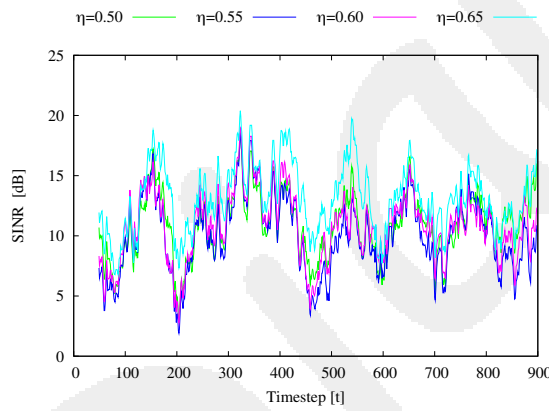


Fig.222 - SINR average comparison

|                               | $av \{N_{ON}\}$ | $var \{N_{ON}\}$ | $min \{N_{ON}\}$ | $max \{N_{ON}\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 13.55           | 4.36             | 12               | 24               |
| $GA - \eta \in [0.50 - 0.70]$ | 16.82           | 1.73             | 16               | 22               |
| $GA - \eta \in [0.55 - 0.65]$ | 17.66           | 0.75             | 17               | 20               |
| $GA - \eta = 0.50$            | 16              | 0                | 16               | 16               |
| $GA - \eta = 0.55$            | 17              | 0                | 17               | 17               |
| $GA - \eta = 0.60$            | 19              | 0                | 19               | 19               |
| $GA - \eta = 0.65$            | 20              | 0                | 20               | 20               |

Tab.43 - Statistical analysis of the number of active elements  $N_{ON}$ : average  $av \{ \cdot \}$ , variance  $var \{ \cdot \}$ , minimum  $min \{ \cdot \}$  and maximum  $max \{ \cdot \}$ .

|                               | $av \{D [dB]\}$ | $var \{D [dB]\}$      | $min \{D [dB]\}$ | $max \{D [dB]\}$ |
|-------------------------------|-----------------|-----------------------|------------------|------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 11.27           | $3.73 \times 10^{-1}$ | 10.79            | 13.80            |
| $GA - \eta \in [0.50 - 0.70]$ | 12.25           | $1.03 \times 10^{-1}$ | 12.04            | 13.42            |
| $GA - \eta \in [0.55 - 0.65]$ | 12.46           | $4.30 \times 10^{-2}$ | 12.30            | 13.01            |
| $GA - \eta = 0.50$            | 12.04           | 0                     | 12.04            | 12.04            |
| $GA - \eta = 0.55$            | 12.30           | 0                     | 12.30            | 12.30            |
| $GA - \eta = 0.60$            | 12.79           | 0                     | 12.79            | 12.79            |
| $GA - \eta = 0.65$            | 13.01           | 0                     | 13.01            | 13.01            |

**Tab.44 - Statistical analysis of the directivity  $D [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**

**Observations:**

- Fig.222 riporta l'andamento medio del  $SINR$  in  $dB$  mediato sui 50 timesteps precedenti;
- Le prestazioni della tecnica sono di poco inferiori rispetto alla tecnica SINR-based per i casi in cui  $\eta$  è definito all'interno di un intervallo: tendenzialmente la tecnica cerca soluzioni con il minimo numero possibile di elementi attivi;
- E' interessante osservare che le soluzioni ricavate dalla tecnica minPwr nel caso in cui si consideri  $\eta$  definito da un singolo valore sono le stesse ricavate dalla tecnica SINR-based (partendo dalla stessa inizializzazione della popolazione): di conseguenza otteniamo in questo caso pari prestazioni;

# TEST CASE 15 - MinPwr Approach - 64 Elements - Time-Varying Scenario

## Goal

Maximization of the SINR using genetic algorithms (GA) to determine the optimal thinned array configuration, considering a time-varying scenario.

## Test Case Description

- Number of Elements  $N = 64$
- Elements Spacing:  $d = 0.5\lambda$
- Max Gain Pattern Direction :  $\theta^d = 90^\circ, \phi^d = 90^\circ$
- Desired Signal Power:  $0 \text{ dB}$
- Interference Power:  $30 \text{ dB}$
- Noise Power:  $-30 \text{ dB}$
- Timesteps:  $T = 900$
- Number of Interferences:  $N_t^I \in [1 - 5]; t = 1, \dots, T$
- Interference Direction Of Arrival:  $\theta_j^i = 90^\circ, \phi_j^i \in [0^\circ - 180^\circ]; j = 1, \dots, N_t^I$

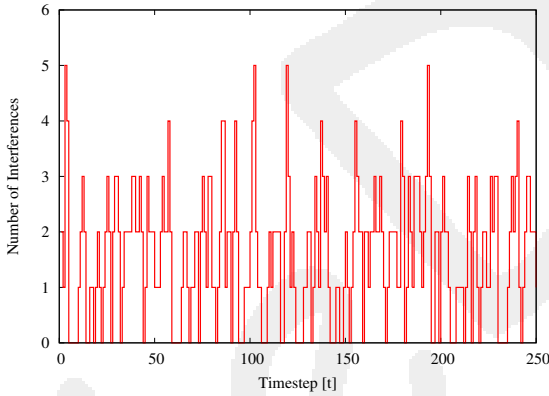


Fig.223 - Number of Interferences

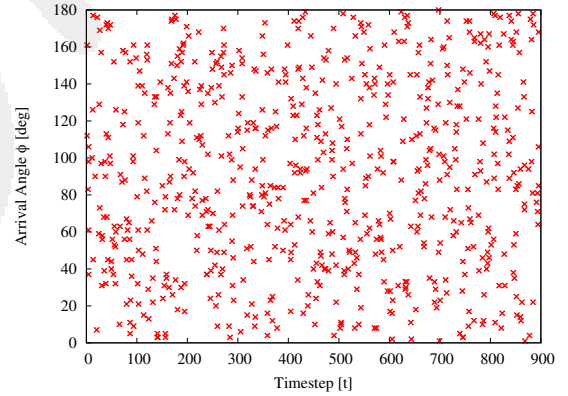


Fig.224 - Arrival Angle

## Optimization Approach: GA

- Number of Variables:  $X = 64$  ( $\alpha_n, n = 1, \dots, N$ )
- Population: 32
- Crossover Probability: 0.9
- Mutation Probability: 0.01
- Number of Generations: 200
- Thinning Coefficient Range:  $\eta \in [0.40-0.80], \eta \in [0.50-0.70], \eta \in [0.55-0.65], \eta = 0.50, \eta = 0.55, \eta = 0.60$

GA - minPwr Approach - 64 Elements - Time-Varying Scenario

|                               | $av \{SINR [dB]\}$ | $var \{SINR [dB]\}$ | $min \{SINR [dB]\}$ | $max \{SINR [dB]\}$ |
|-------------------------------|--------------------|---------------------|---------------------|---------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 18.47              | 299.24              | -30.01              | 44.15               |
| $GA - \eta \in [0.50 - 0.70]$ | 20.98              | 303.60              | -30.00              | 45.05               |
| $GA - \eta \in [0.55 - 0.65]$ | 22.31              | 305.73              | -30.00              | 45.56               |
| $GA - \eta = 0.50$            | 20.98              | 335.61              | -30.00              | 45.05               |
| $GA - \eta = 0.55$            | 20.26              | 360.73              | -30.00              | 45.44               |
| $GA - \eta = 0.60$            | 22.52              | 337.94              | -30.00              | 45.80               |

Tab.45 - Statistical analysis of the signal-to-noise-plus-interference-ratio expressed in dB values  
 $SINR [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

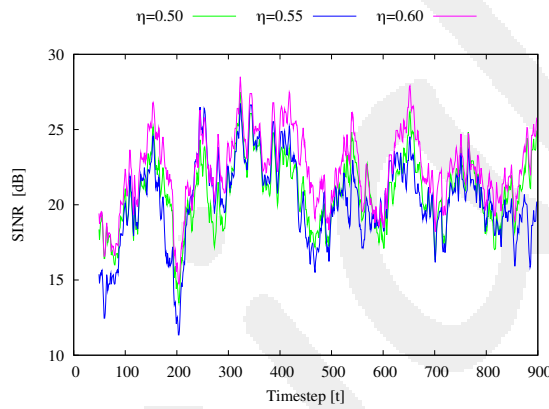


Fig.225 - SINR average comparison

|                               | $av \{N_{ON}\}$ | $var \{N_{ON}\}$ | $min \{N_{ON}\}$ | $max \{N_{ON}\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 26.41           | 4.91             | 25               | 40               |
| $GA - \eta \in [0.50 - 0.70]$ | 32.63           | 1.57             | 32               | 40               |
| $GA - \eta \in [0.55 - 0.65]$ | 35.45           | 0.71             | 35               | 41               |
| $GA - \eta = 0.50$            | 64              | 0                | 64               | 64               |
| $GA - \eta = 0.55$            | 70              | 0                | 70               | 70               |
| $GA - \eta = 0.60$            | 76              | 0                | 76               | 76               |

Tab.46 - Statistical analysis of the number of active elements  $N_{ON}$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

|                               | $av \{D [dB]\}$ | $var \{D [dB]\}$      | $min \{D [dB]\}$ | $max \{D [dB]\}$ |
|-------------------------------|-----------------|-----------------------|------------------|------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 14.20           | $1.14 \times 10^{-1}$ | 13.97            | 16.02            |
| $GA - \eta \in [0.50 - 0.70]$ | 15.13           | $2.55 \times 10^{-2}$ | 15.05            | 16.02            |
| $GA - \eta \in [0.55 - 0.65]$ | 15.49           | $1.00 \times 10^{-2}$ | 15.44            | 16.13            |
| $GA - \eta = 0.50$            | 15.05           | 0                     | 15.05            | 15.05            |
| $GA - \eta = 0.55$            | 15.44           | 0                     | 15.44            | 15.44            |
| $GA - \eta = 0.60$            | 15.80           | 0                     | 15.80            | 15.80            |

**Tab.47 - Statistical analysis of the directivity  $D [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**

**Observations:**

- Fig.225 riporta l'andamento medio del  $SINR$  in  $dB$  mediato sui 50 timesteps precedenti;
- Le prestazioni della tecnica sono di poco inferiori rispetto alla tecnica SINR-based per i casi in cui  $\eta$  è definito all'interno di un intervallo: tendenzialmente la tecnica cerca soluzioni con il minimo numero possibile di elementi attivi;
- E' interessante osservare che le soluzioni ricavate dalla tecnica minPwr nel caso in cui si condideri  $\eta$  definito da un singolo valore sono le stesse ricavate dalla tecnica SINR-based (partendo dalla stessa inizializzazione della popolazione): di conseguenza otteniamo in questo caso pari prestazioni;



# TEST CASE 16 - MinPwr Approach - 128 Elements - Time-Varying Scenario

## Goal

Maximization of the SINR using genetic algorithms (GA) to determine the optimal thinned array configuration, considering a time-varying scenario.

## Test Case Description

- Number of Elements  $N = 128$
- Elements Spacing:  $d = 0.5\lambda$
- Max Gain Pattern Direction :  $\theta^d = 90^\circ, \phi^d = 90^\circ$
- Desired Signal Power:  $0 \text{ dB}$
- Interference Power:  $30 \text{ dB}$
- Noise Power:  $-30 \text{ dB}$
- Timesteps:  $T = 900$
- Number of Interferences:  $N_t^I \in [1 - 5]; t = 1, \dots, T$
- Interference Direction Of Arrival:  $\theta_j^i = 90^\circ, \phi_j^i \in [0^\circ - 180^\circ]; j = 1, \dots, N_t^I$

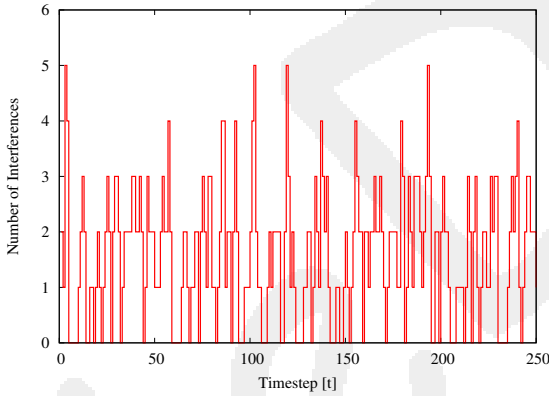


Fig.226 - Number of Interferences

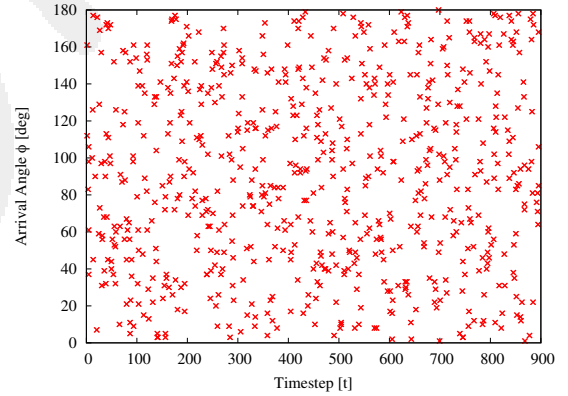


Fig.227 - Arrival Angle

## Optimization Approach: GA

- Number of Variables:  $X = 128 (\alpha_n, n = 1, \dots, N)$
- Population: 64
- Crossover Probability: 0.9
- Mutation Probability: 0.01
- Number of Generations: 200
- Thinning Coefficient Range:  $\eta \in [0.40-0.80], \eta \in [0.50-0.70], \eta \in [0.55-0.65], \eta = 0.50, \eta = 0.55, \eta = 0.60$

GA - minPwr Approach - 128 Elements - Time-Varying Scenario

|                               | $av \{SINR [dB]\}$ | $var \{SINR [dB]\}$ | $min \{SINR [dB]\}$ | $max \{SINR [dB]\}$ |
|-------------------------------|--------------------|---------------------|---------------------|---------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 20.70              | 302.30              | -30.01              | 47.16               |
| $GA - \eta \in [0.50 - 0.70]$ | 23.80              | 295.25              | -30.00              | 48.06               |
| $GA - \eta \in [0.55 - 0.65]$ | 25.62              | 294.55              | -30.00              | 48.45               |
| $GA - \eta = 0.50$            | 30.38              | 275.39              | -30.00              | 48.06               |
| $GA - \eta = 0.55$            | 31.12              | 283.91              | -30.00              | 48.45               |
| $GA - \eta = 0.60$            | 31.63              | 270.89              | -30.00              | 48.81               |

Tab.48 - Statistical analysis of the signal-to-noise-plus-interference-ration expressed in dB values  
 $SINR [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

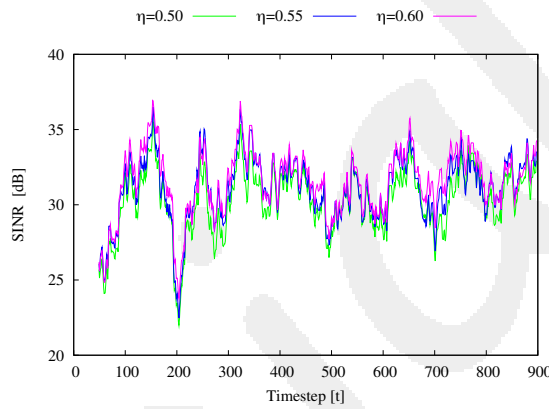


Fig.228 - SINR average comparison

|                               | $av \{N_{ON}\}$ | $var \{N_{ON}\}$ | $min \{N_{ON}\}$ | $max \{N_{ON}\}$ |
|-------------------------------|-----------------|------------------|------------------|------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 52.89           | 8.95             | 51               | 67               |
| $GA - \eta \in [0.50 - 0.70]$ | 64.96           | 3.37             | 64               | 80               |
| $GA - \eta \in [0.55 - 0.65]$ | 70.66           | 1.95             | 70               | 80               |
| $GA - \eta = 0.50$            | 64              | 0                | 64               | 64               |
| $GA - \eta = 0.55$            | 70              | 0                | 70               | 70               |
| $GA - \eta = 0.60$            | 76              | 0                | 76               | 76               |

Tab.49 - Statistical analysis of the number of active elements  $N_{ON}$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .

|                               | $av \{D [dB]\}$ | $var \{D [dB]\}$      | $min \{D [dB]\}$ | $max \{D [dB]\}$ |
|-------------------------------|-----------------|-----------------------|------------------|------------------|
| $GA - \eta \in [0.40 - 0.80]$ | 17.23           | $5.47 \times 10^{-2}$ | 17.08            | 18.26            |
| $GA - \eta \in [0.50 - 0.70]$ | 18.12           | $1.40 \times 10^{-2}$ | 18.06            | 19.03            |
| $GA - \eta \in [0.55 - 0.65]$ | 18.48           | $6.97 \times 10^{-3}$ | 18.45            | 19.03            |
| $GA - \eta = 0.50$            | 18.06           | 0                     | 18.06            | 18.06            |
| $GA - \eta = 0.55$            | 18.45           | 0                     | 18.45            | 18.45            |
| $GA - \eta = 0.60$            | 18.81           | 0                     | 18.81            | 18.81            |

**Tab.50 - Statistical analysis of the directivity  $D [dB]$ : average  $av \{\cdot\}$ , variance  $var \{\cdot\}$ , minimum  $min \{\cdot\}$  and maximum  $max \{\cdot\}$ .**

### Observations:

- Fig.228 riporta l'andamento medio del  $SINR$  in  $dB$  mediato sui 50 timesteps precedenti;
- Le prestazioni della tecnica sono inferiori rispetto alla tecnica  $SINR$ -based per i casi in cui  $\eta$  è definito all'interno di un intervallo: tendenzialmente la tecnica cerca soluzioni con il minimo numero possibile di elementi attivi;
- E' interessante osservare che le soluzioni ricavate dalla tecnica  $minPwr$  nel caso in cui si consideri  $\eta$  definito da un singolo valore sono le stesse ricavate dalla tecnica  $SINR$ -based (partendo dalla stessa inizializzazione della popolazione): di conseguenza otteniamo in questo caso pari prestazioni;

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