Compressive Sensing Based Synthesis of Multi-Beam Phased Array for Air Traffic Control

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1 Numerical Assessment - Linear Array Synthesis

1.1 $P = 2, \theta_1 = 90.75 \deg, \theta_2 = 96.57 \deg$

The test case has been performed using the parameter below.

Parameter	Values					
γ_a	0.100	0.309	0.954	2.947	9.103	
	10.985	33.932	104.811	323.746	1000.000 🤇	
γ_b	0.0001	0.00054	0.00295	0.01600	0.08685	
	0.47149	2.55955	13.89495	75.43120	100.00000	
Pattern Samples, K	22	24	26	28	30	32
	34	36	38	40	42	44
Aperture Samples, N	500	600	700	800	900	1000
Noise Variance, σ	0.000010	0.000031	0.000095	0.000295	0.000910	
	0.002812	0.008685	0.026827	0.082864	0.100000	

Table I: Simulation Parameters



Figure 1: Output solutions from MT-BCS procedure

Fig.1 shows the solutions of the MT-BCS procedure having number of elements $M \leq 22$. The y-axis represents the mean error between the reference power patterns and the power pattern at the output of the MT-BCS.



Figure 2: Parameters distribution, (a) γ_a , (b) γ_b , (c) Pattern Samples, (d) Aperture Samples, (e) Noise Variance

Fig.2 shows parameter distributions as function of "Best results" (the ones with error value under 8.0×10^{-1} and number of MT-BCS elements lower than 19, sorted by error value) and number of elements.

1.1.1 Solution: Best M = 15

γ_a	γ_b	Pattern Samples [K]	Aperture Samples [N]	Noise Variance
323.746	13.89495	42	1000	0.026827

Table II: MT-BCS Input Parameters

In *Tab.II* are reported MT-BCS parameters of solution Best M = 15. *Fig.3* shows elements positions of MT-BCS sparse linear array obtained from solution M = 15.



Figure 3: MT-BCS array elements positions

Pattern $\theta_1 = 90.75 deg$



Figure 4: Array excitations, (a)Amplitudes, (b)Phases



Figure 5: Power pattern comparison

Fig.4(a), 4(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively. Fig.5 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_1 = 90.75$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_1
Reference	-29.99	12.76	5.82	22	—
MT - BCS	-29.81	12.75	5.84	15	5.1194727×10^{-1}

Table III: Pattern θ_1 performance

In Tab.III comparison between Reference and MT-BCS power pattern performance parameters.

Pattern $\theta_2 = 96.57 deg$



Figure 6: Array excitations, (a)Amplitudes, (b)Phases



Figure 7: Power pattern comparison

Fig. 6(a), 6(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively. Fig. 7 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_2 = 96.57$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_2
Reference	-29.99	12.76	5.86	22	—
MT - BCS	-29.35	12.75	5.87	15	3.6014238×10^{-1}

Table IV: Pattern θ_2 performance

In Tab.IV comparison between Reference and MT-BCS power pattern performance parameters.

1.1.2 MT-BCS errors

In Tab.V are reported the error values. In particular:

- *I*: total number of reference power pattern [*I*];
- ξ : total error of the entire procedure;
- $err_i \ (i = 1, \dots, I)$: error on sigular reference and MT-BCS pattern pair.

Soluti	ion	e	err_1		err	2
Best M	= 15	5.11947	27 >	$< 10^{-1}$	3.6014238	$\times 10^{-1}$
	Sol	ution	Ι		ξ	
Γ	Best	M = 15	2	4.3604	48×10^{-1}	



1.2 $P = 3, \theta_1 = 84.93 \deg, \theta_2 = 90.75 \deg, \theta_3 = 96.57 \deg$

Parameter	Values					
γ_a	0.100	0.309	0.954	2.947	9.103	
	10.985	33.932	104.811	323.746	1000.000	
γ_b	0.0001	0.00054	0.00295	0.01600	0.08685	
	0.47149	2.55955	13.89495	75.43120	100.00000	
Pattern Samples, K	22	24	26	28	30	32
	34	36	38	40	42	44
Aperture Samples, N	500	600	700	800	900	1000
Noise Variance, σ	0.000010	0.000031	0.000095	0.000295	0.000910	
	0.002812	0.008685	0.026827	0.082864	0.100000	

The test case has been performed using the parameters below.

Table VI: Simulation Parameters



Figure 8: Output solutions from MT-BCS procedure

Fig.8 shows the solutions of the MT-BCS procedure having number of elements $M \leq 22$. The y-axis represents the mean error between the reference power patterns and the power pattern at the output of the MT-BCS.



Figure 9: Parameters distribution, (a) γ_a , (b) γ_b , (c) Pattern Samples, (d) Aperture Samples, (e) Noise Variance

Fig.9 shows parameter distributions as function of "Best Results" (the ones with error value under 8.0×10^{-1} and number of MT-BCS elements lower than 18, sorted by error value) and number of elements.

From Fig.9 it is possible to notice that there are no "Best Results" with M = 15 number of elements.

1.2.1 Solution: Best M = 16

γ_a	γ_b	Pattern Samples [K]	Aperture Samples [N]	Noise Variance
323.746	0.47149	44	500	0.008685

Table VII: MT-BCS Input Parameters

In *Tab.VII* are reported MT-BCS parameters of solution Best M = 16. *Fig.10* shows elements positions of MT-BCS sparse linear array obtained from solution Best M = 16.



Figure 10: MT-BCS array elements positions

Pattern $\theta_1 = 84.93 deg$



Figure 11: Array excitations, (a)Amplitudes, (b)Phases



Figure 12: Power pattern comparison

Fig. 11(a), 11(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.12 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_1 = 84.93$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_1
Reference	-29.99	12.77	5.84	22	—
MT - BCS	-29.34	12.76	5.85	16	1.7800032×10^{-1}

Table VIII: Pattern θ_1 performance

In Tab.VIII comparison between Reference and MT-BCS power pattern performance parameters.

Pattern $\theta_2 = 90.75 deg$



Figure 13: Array Excitations, (a)Amplitudes, (b)Phases



Figure 14: Power pattern comparison

Fig. 13(a), 13(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.14 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_2 = 90.75$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_2
Reference	-29.99	12.77	5.82	22	_
MT - BCS	-29.92	12.76	5.83	16	1.9301757×10^{-1}

Table IX: Pattern θ_2 performance

In Tab.IX comparison between Reference and MT-BCS power pattern performance parameters.

Pattern $\theta_3 = 96.57 deg$



Figure 15: Array Excitations, (a)Amplitudes, (b)Phases



Figure 16: Power pattern comparison

Fig. 15(a), 15(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.16 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_3 = 96.57$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_3
Reference	-29.99	12.77	5.86	22	—
MT - BCS	-29.61	12.76	5.87	16	1.8657449×10^{-1}

Table X: Pattern θ_3 performance

In Tab.X comparison between Reference and MT-BCS power pattern performance parameters.

1.2.2 MT-BCS errors

In *Tab.XI* are reported the error values. In particular:

- *I*: total number of reference power pattern [*I*];
- ξ : total error of the entire procedure;
- $err_i \ (i = 1, \dots, I)$: error on sigular reference and MT-BCS pattern pair.

Solution	err_1	err_2	err_3
Best $M = 16$	1.7800032×10^{-1}	1.9301757×10^{-1}	1.8657449×10^{-1}

Solution	Ι	ξ
Best $M = 16$	3	1.858641×10^{-1}

Table XI: MT-BCS errors

1.3
$$P = 4, \theta_1 = 79.06 \deg, \theta_2 = 84.93 \deg, \theta_3 = 90.75 \deg, \theta_3 = 96.57 \deg$$

Parameter	Values					
γ_a	0.100	0.309	0.954	2.947	9.103	
	10.985	33.932	104.811	323.746	1000.000	
γ_b	0.0001	0.00054	0.00295	0.01600	0.08685	
	0.47149	2.55955	13.89495	75.43120	100.00000	
Pattern Samples, K	22	24	26	28	30	32
	34	36	38	40	42	44
Aperture Samples, N	500	600	700	800	900	1000
Noise Variance, σ	0.000010	0.000031	0.000095	0.000295	0.000910	
	0.002812	0.008685	0.026827	0.082864	0.100000	

The test case has been performed using the parameters below.

Table XII: Simulation Parameters



Figure 17: Output solutions from MT-BCS procedure

Fig.17 shows the solutions of the MT-BCS procedure having number of elements $M \leq 22$. The y-axis represents the mean error between the reference power patterns and the power pattern at the output of the MT-BCS.



Figure 18: Parameters distribution, (a) γ_a , (b) γ_b , (c) Pattern Samples, (d) Aperture Samples, (e) Noise Variance

Fig.18 shows parameter distributions as function of "Best Results" (solutions with error value under 8.0×10^{-1} and number of MT-BCS elements lower than 18, sorted by error value) and number of elements.

1.3.1 Solution: Best M = 15

γ_a	γ_b	Pattern Samples [K]	Aperture Samples [N]	Noise Variance
104.811	0.47149	40	600	0.00091

Table XIII: MT-BCS Input Parameters

In *Tab.XIII* are reported MT-BCS parameters of solution Best M = 15. *Fig.19* shows elements positions of MT-BCS sparse linear array obtained from solution Best M = 15.



Figure 19: MT-BCS array elements positions

Pattern $\theta_1 = 79.06 deg$



Figure 20: Array excitations, (a)Amplitudes, (b)Phases



Figure 21: Power pattern comparison

Fig. 20(a), 20(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.21 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_1 = 79.06$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_1
Reference	-29.99	12.76	5.93	22	—
MT - BCS	-29.22	12.74	5.97	15	8.2470542×10^{-1}

Table XIV: Pattern θ_1 performance

In Tab.XIV comparison between Reference and MT-BCS power pattern performance parameters.

Pattern $\theta_2 = 84.93 deg$



Figure 22: Array Excitations, (a)Amplitudes, (b)Phases



Figure 23: Power pattern comparison

Fig. 22(a), 22(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.23 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_2 = 84.93$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	$HPBW\left[deg ight]$	M	err_2
Reference	-29.99	12.77	5.84	22	_
MT - BCS	-29.31	12.74	5.88	15	6.596669×10^{-1}

Table XV: Pattern θ_2 performance

In Tab.XV comparison between Reference and MT-BCS power pattern performance parameters.

Pattern $\theta_3 = 90.75 deg$



Figure 24: Array Excitations, (a)Amplitudes, (b)Phases



Figure 25: Power pattern comparison

Fig. 24(a), 24(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.25 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_3 = 90.75$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_3
Reference	-29.99	12.77	5.82	22	_
MT - BCS	-29.36	12.74	5.85	15	6.5778869×10^{-1}

Table XVI: Pattern θ_3 performance

In Tab.XVI comparison between Reference and MT-BCS power pattern performance parameters.

Pattern $\theta_4 = 96.57 deg$



Figure 26: Array Excitations, (a)Amplitudes, (b)Phases



Figure 27: Power pattern comparison

Fig. 26(a), 26(b) show comparison between Reference and MT-BCS amplitudes and phases excitations respectively.

Fig.27 shows the comparison between Reference and MT-BCS power pattern for the steereng angle $\theta_4 = 96.57$ degrees.

	$SLL\left[dB ight]$	$D\left[dB ight]$	HPBW[deg]	M	err_4
Reference	-29.99	12.77	5.86	22	_
MT - BCS	-29.16	12.74	5.89	15	7.1513563×10^{-1}

Table XVII: Pattern $\theta_4 \mathrm{performance}$

In Tab.XVII comparison between Reference and MT-BCS power pattern performance parameters.

1.3.2 MT-BCS errors

In *Tab.XVIII* are reported the error values. In particular:

- *I*: total number of reference power pattern [*I*];
- ξ : total error of the entire procedure;
- $err_i \ (i = 1, \dots, I)$: error on sigular reference and MT-BCS pattern pair.

Solution	err_1	err_2	err_3	err_4
Best $M = 15$	8.247054×10^{-1}	6.596669×10^{-1}	6.577887×10^{-1}	7.151356×10^{-1}

Solution	Ι	ξ
Best $M = 15$	4	7.143242×10^{-1}

Table XVIII: MT-BCS errors

More information on the topics of this document can be found in the following list of references.

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