



# Study of Barankin bound vs Cramér-Rao bound for interferometric-like array design at low SNR

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## ARTICLE INFO

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## ABSTRACT

In this paper, we address the antenna array design problem at low signal-to-noise ratio (SNR). The Cramér-Rao bound (CRB) is the most commonly used criterion to solve the array optimization problem due to its computing simplicity and tightness in the asymptotical region. However, there exists a threshold SNR at which the estimation variance significantly deviates from the CRB. In this case, the CRB is no longer a tight bound. To address this issue, we propose the use of the Barankin Bound (BB) on the source location and source intensity in astrometry and photometry problems as an alternative optimization criterion. BB provides a mean square error (MSE)-optimal trade-off mainlobe width and sidelobe level of beampattern. The performance of the obtained array geometries is assessed and compared by evaluating the aforementioned bounds and the mean square error (MSE) on the estimation of source location and intensity. The simulation results illustrate that the BB-based criterion provides a trade-off between increasing the estimation accuracy and reducing the ambiguity.

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## Figures and tables

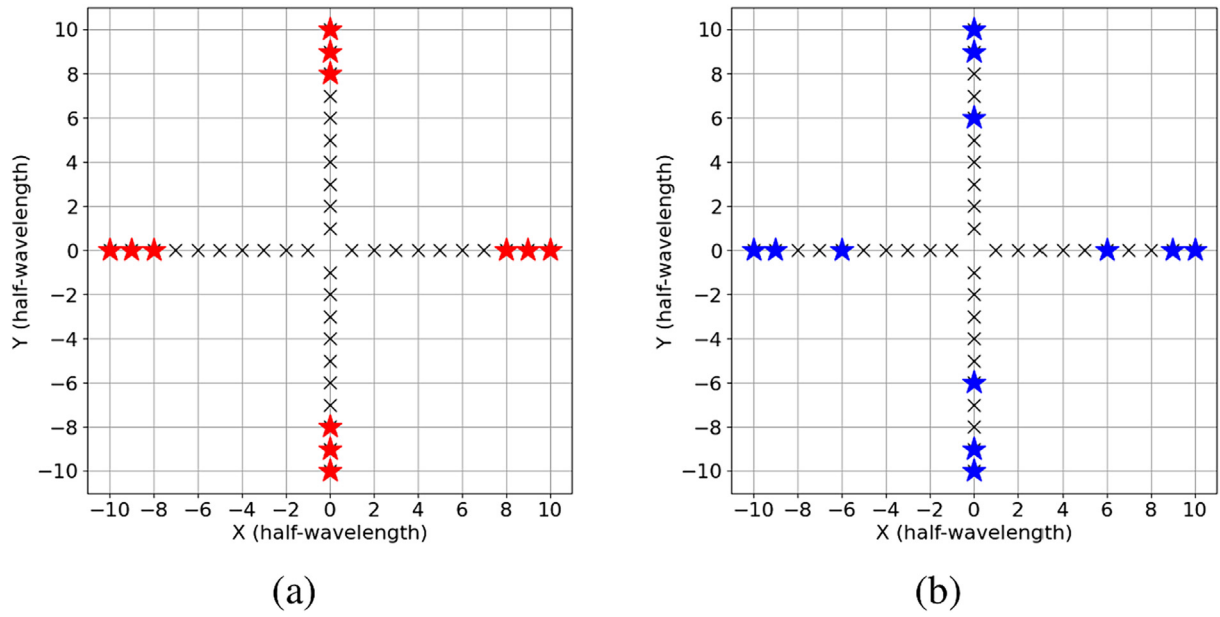


Fig. 1. The antenna array given by (a) CRB-based criterion, (b) BB-based criterion.

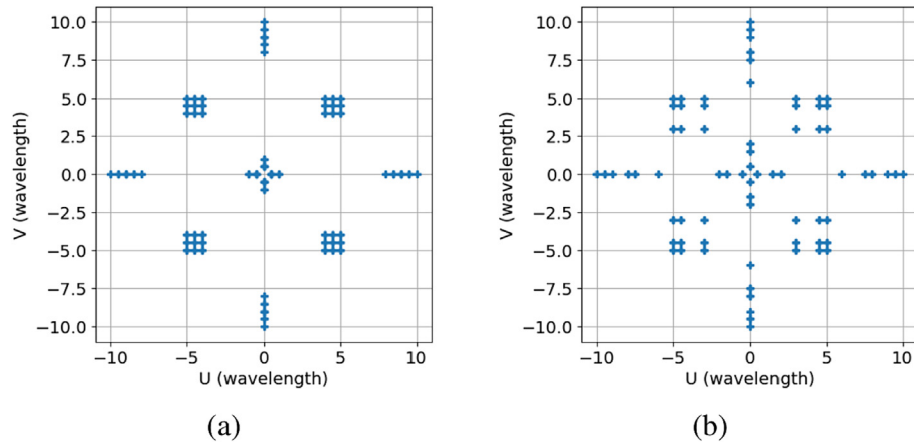


Fig. 2. The UV plane coverage of the array given by (a) CRB-based criterion, (b) BB-based criterion.

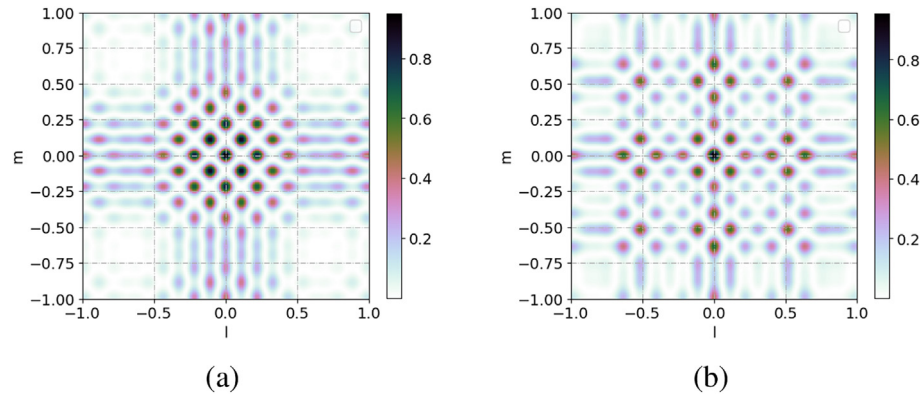
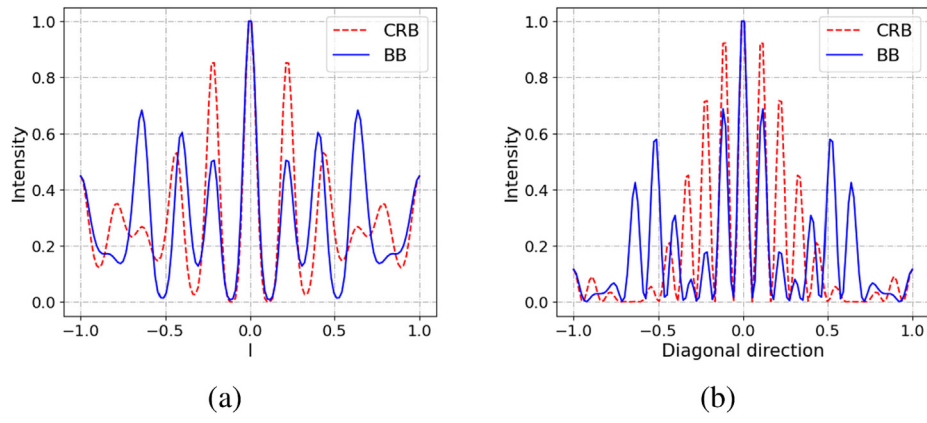
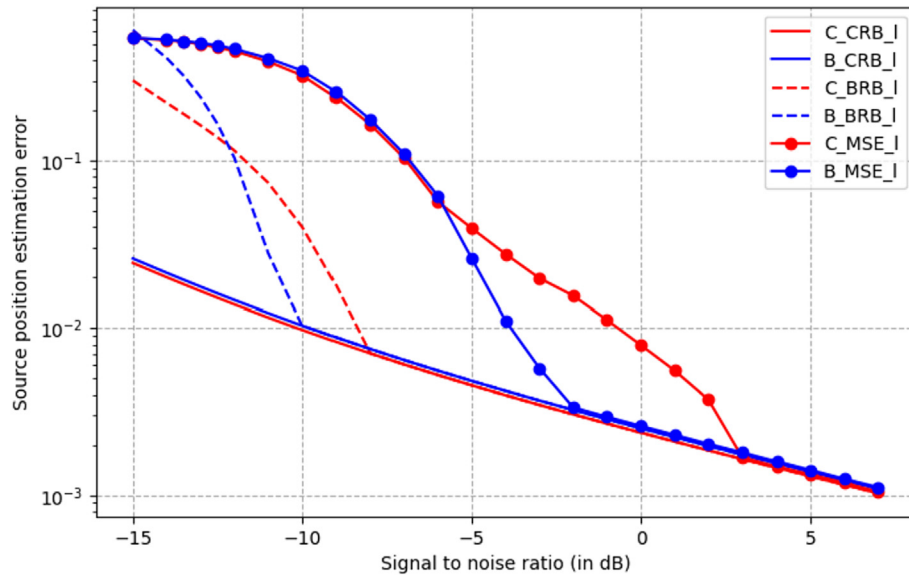


Fig. 3. (a) The 2D beampattern of the array given by CRB-based criterion. (b) The 2D beampattern of the array given by BB-based criterion.



**Fig. 4.** (a) The 1D beam pattern of the  $l$ -direction. (b) The 1D beam pattern of the diagonal direction. Red dashed (blue solid) lines represent the result of the array geometries given by CRB (BB)-based optimization criteria. Since it is quite difficult to compare directly the 2D beam patterns, two special axes are selected to better illustrate the beam pattern in 1D: the  $l$ -direction and the diagonal direction ( $l = m$ ), which are shown in Fig. 4.



**Fig. 5.** Bounds and MSEs on  $l$  estimation. Solid lines, dashed lines, and solid lines with points markers in red (blue) represent the CRB, BB, and MSEs of the array geometries given by CRB (BB)-based optimization criteria.

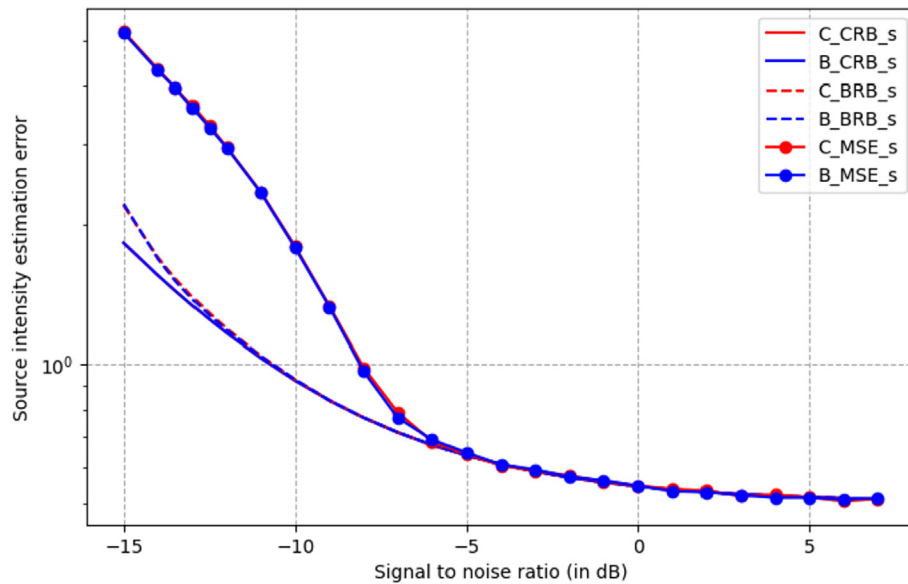


Fig. 6. Bounds and MSE on  $\sigma_s^2$  estimation. Solid lines, dashed lines, and solid lines with points markers in red (blue) represent the CRB, BB, and MSEs of the array geometries given by CRB (BB)-based optimization criteria.

### CRedit authorship contribution statement

**Jianhua Wang:** Writing – original draft, Software, Methodology, Formal analysis. **Lucien Bacharach:** Writing – review & editing, Methodology, Formal analysis. **Mohammed Nabil El Korso:** Writing – review & editing, Methodology, Formal analysis. **Pascal Larzabal:** Writing – review & editing, Methodology, Formal analysis.

### Data availability

Data will be made available on request.

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### Declaration of interests

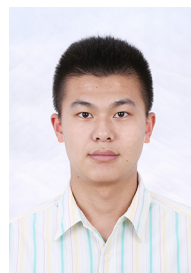
The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

### Further reading

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