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# (Self-)calibration: from knowing everything to knowing nothing at all

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# A quote from Wim Brouw

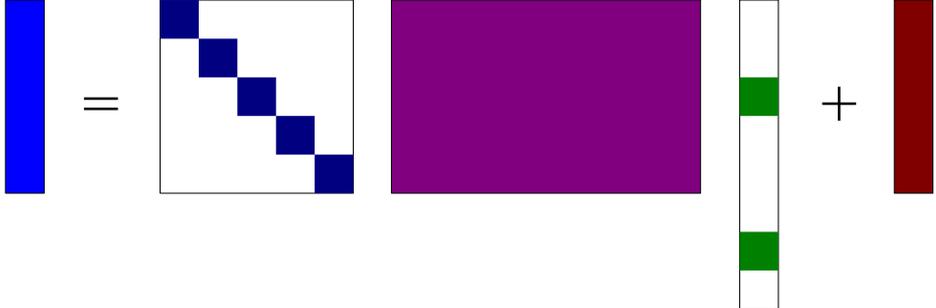
Self-calibration uses the observed data to calibrate themselves. At first sight this sounds like lifting yourself out of quicksand by pulling your hair. However, two properties make this feat possible:

- most observing errors occur on a per array-element (telescope) basis: atmospheric disturbances are above one telescope, receiver instabilities are for receivers in one telescope (or at least decoupled from similar instabilities in other telescopes).
- even an at first sight crowded sky field is mostly devoid of radiation, making it possible to model the sky with a limited number of source components

Source: W. N. Brouw, "The synthesis radio telescope: principles of operation; evolution of data processing." In: E. Raimond and R. Genee (eds.), "The Westerbork Observatory, Continuing Adventures in Radio Astronomy," Kluwer, 1996.

# Exploiting sparsity (1)

Data model (ME) with a “limited number of source components”

$$\mathbf{x}(t) = \mathbf{G} \mathbf{A} \mathbf{s}(t) + \mathbf{n}(t)$$


Voltage / signal domain solution proposed and demonstrated

- Kazemi et al., IEEE ICASSP, June 2015

Minor detail: calibration on 1 s of data for a single 195 kHz subband of LOFAR may require  $10^7$  Yflop (1 Yottaflop =  $10^{24}$  flop)

***Conceptually nice, but we may need some speed-up here ...***

# Exploiting sparsity (2)

Data model (ME) in power / visibility domain

$$\mathbf{R} = \mathbf{G} \mathbf{A} \mathbf{\Sigma} \mathbf{A}^H \mathbf{G}^H + \mathbf{\Sigma}_n$$

Problem is non-convex, but can be solved iteratively

- Wijnholds & Chiarucci, EuSiPCo, August 2016

Compute requirements for calibration of a single subband of LOFAR data reduced from  $10^7$  Yflop to 10 Gflop (station correlator:  $\sim 1$  Gflop)

# Application to LOFAR

Chiarucci & Wijnholds, MNRAS, under review

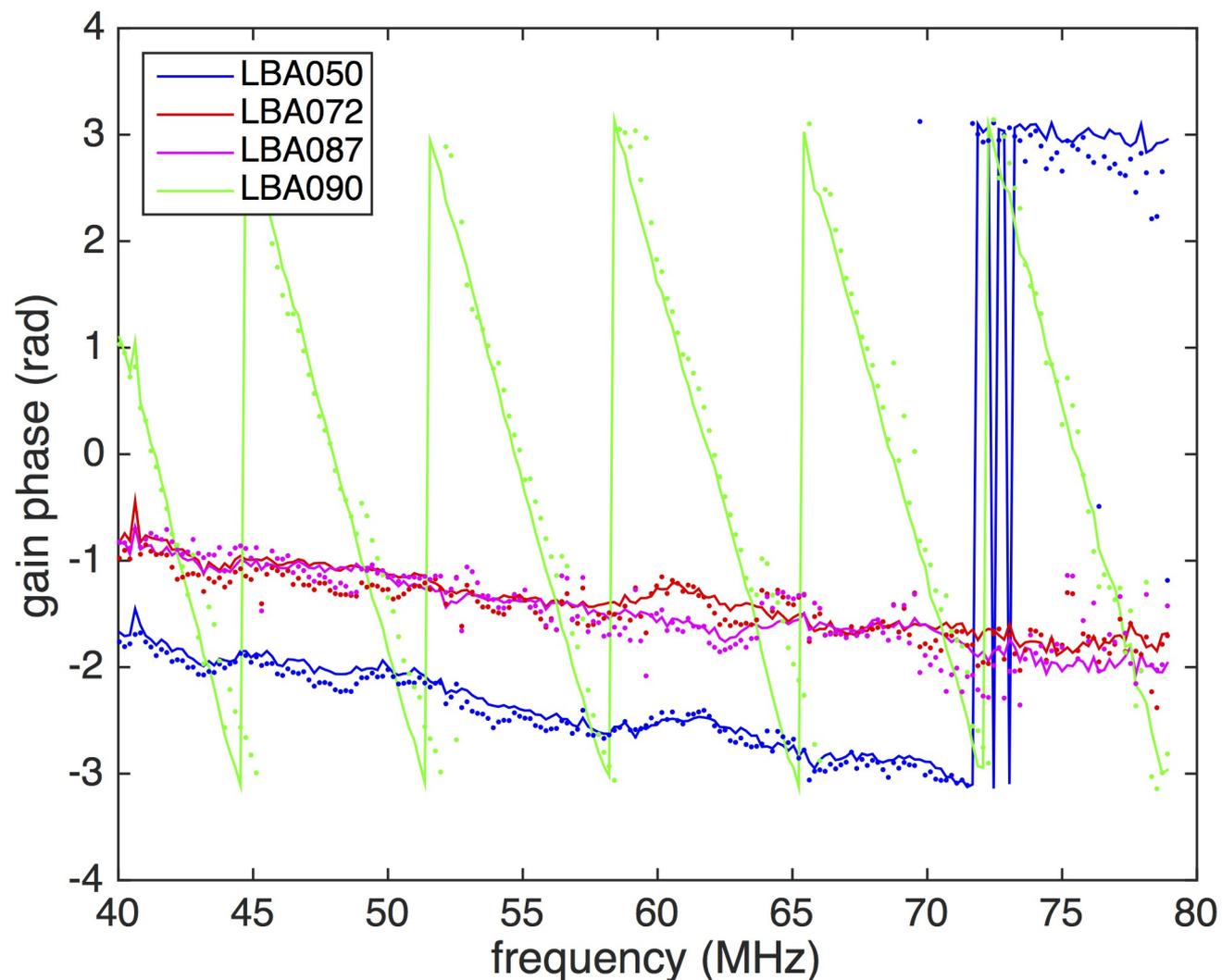
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gain phase solutions from blind calibration and standard calibration

CS002 LBA outer

Subbands 205 – 45  
(40.0 – 78.9 MHz)

Coarse alignment  
( $\Delta l, \Delta m = 0.0185$ )



# The phase transition diagram

Donoho & Tanner, Proc. IEEE, June 2010

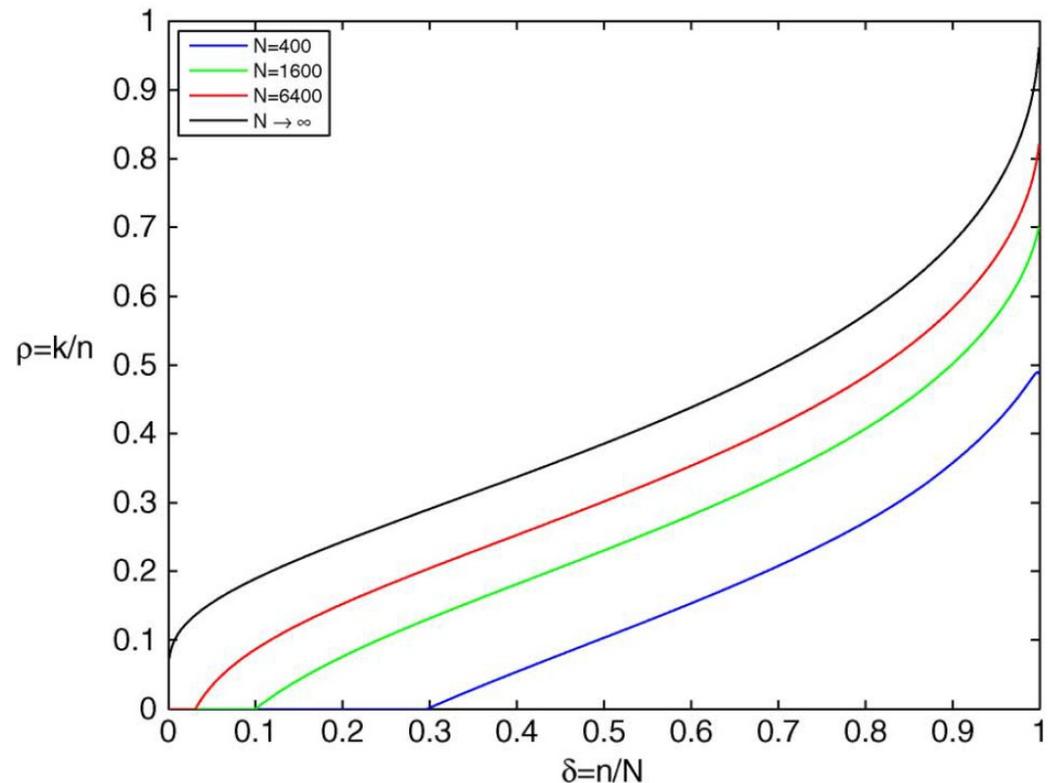
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$\rho$  (sparsity factor): #components / #measurements

$\delta$  (undersampling factor): #measurements / #parameters

DT-curve: 50% chance of successful reconstruction

DT-curve shifts towards lower right with decreasing problem size



# Probability of success

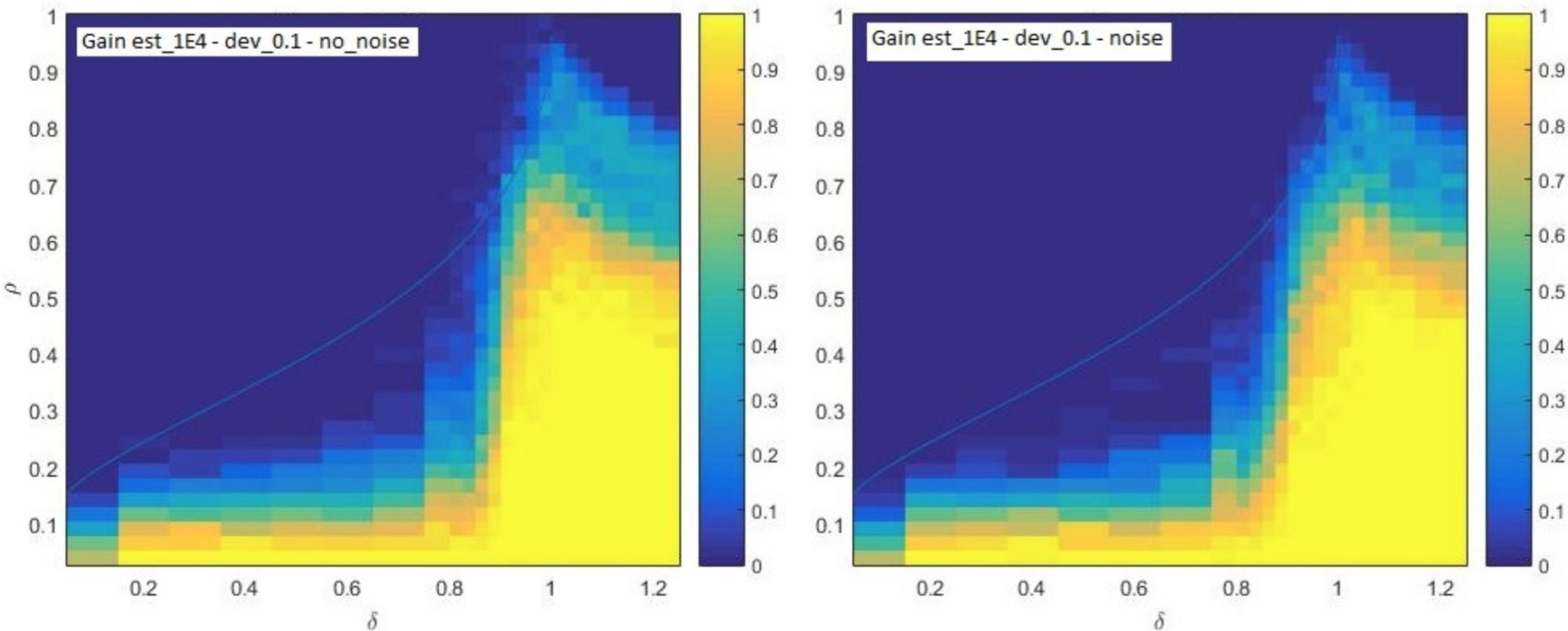
Chiarucci & Wijnholds, MNRAS, under review

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Simulation for 20-element  $\frac{1}{2}\lambda$ -spaced Uniform Linear Array

$\rho$  (sparsity factor): #sources / #unique visibilities (39)

$\delta$  (undersampling factor): #unique visibilities (39) / #image grid points



# Impact of redundancy

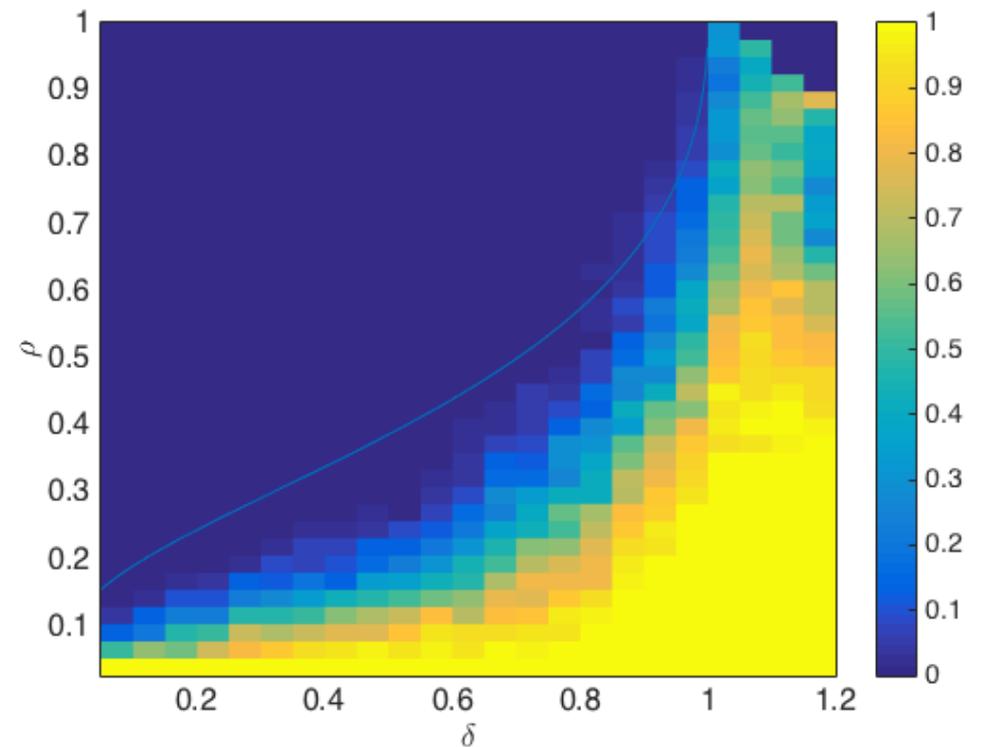
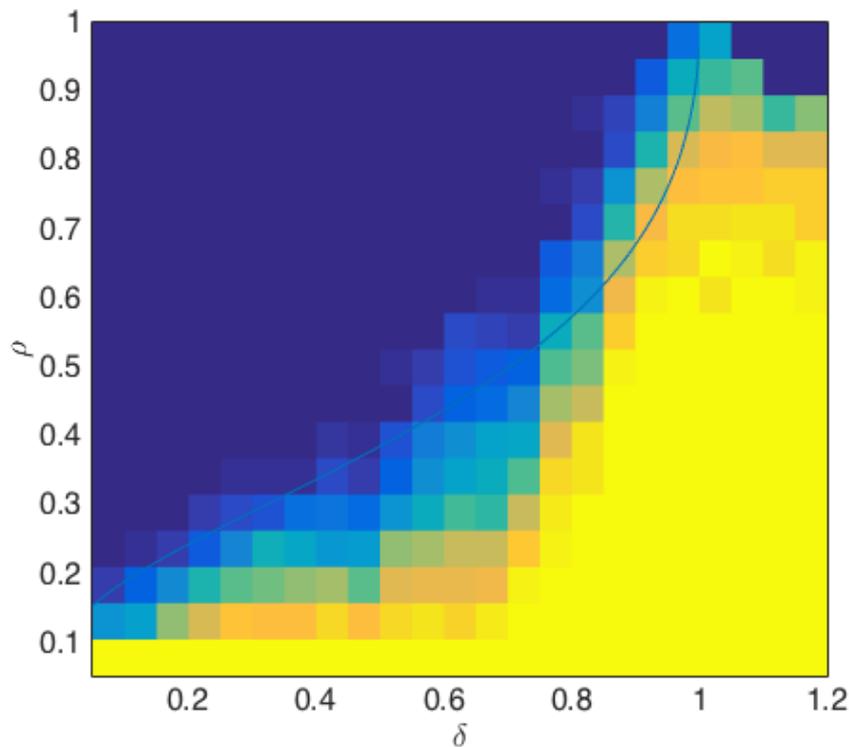
Chiarucci & Wijnholds, MNRAS, under review

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Left: phase diagram for minimum redundant array

Right: phase diagram for irregular array

**Lower redundancy brings us closer to DT curve**



# Implications for self-cal

Chiarucci & Wijnholds, MNRAS, under review

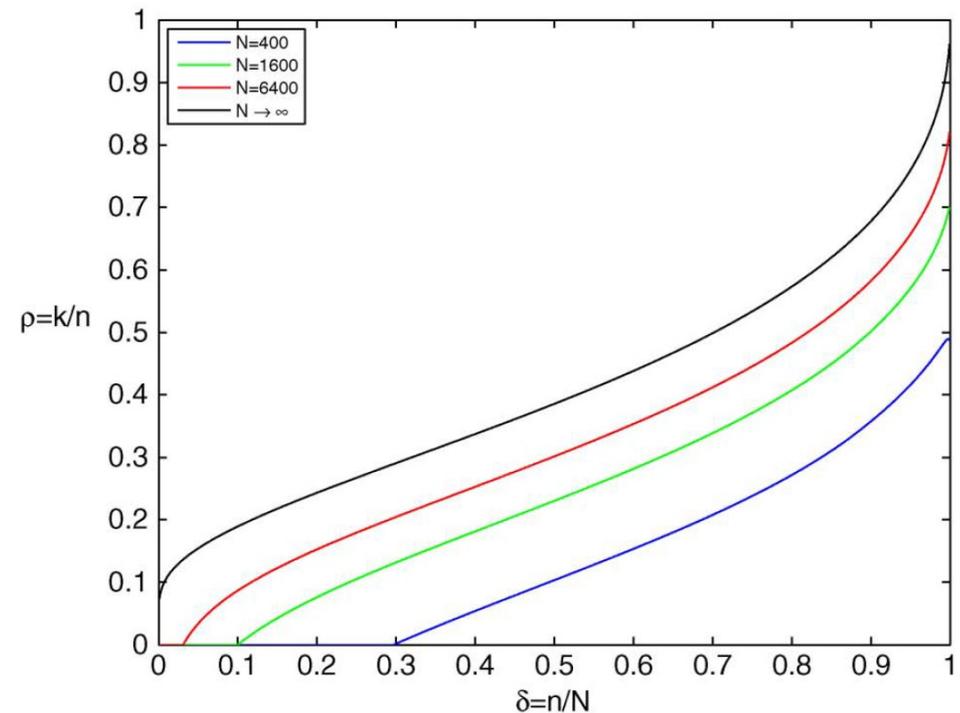
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Observations:

- If map is not confusion limited,  $\rho < 0.1$
- Synthesis observations provide good  $(u,v)$ -coverage:  $\delta > 0.2$
- Large problem size:  $N \sim 10^6 - 10^9$

Blind calibration with sparsity constraint is almost sure to work.

Self-calibration should be able to recover from poor initial estimate.



# A closer look at the LOFAR result

Chiarucci & Wijnholds, MNRAS, under review

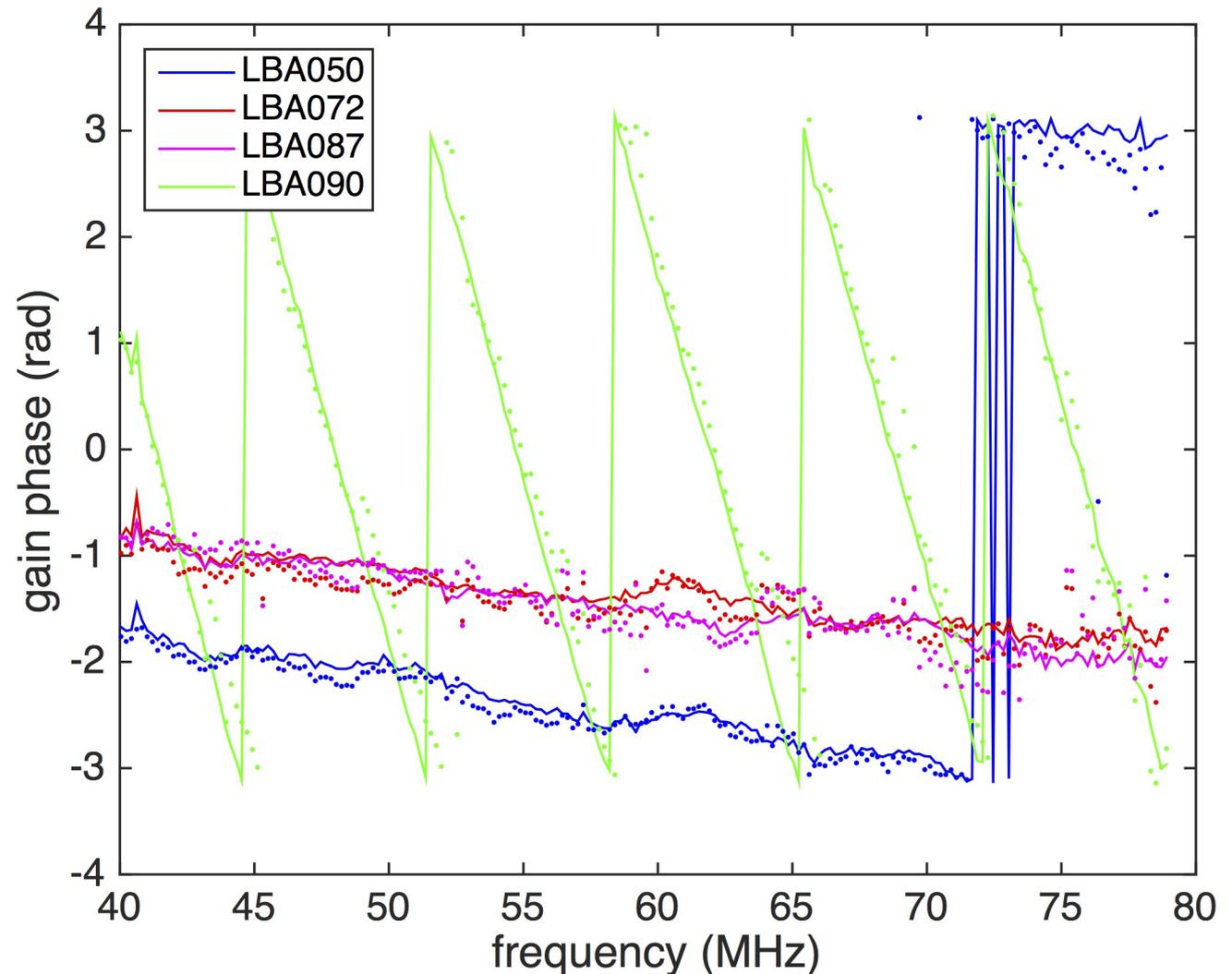
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## Theoretical result

If the source model is identifiable, the Cramer Rao bound for image reconstruction is identical to that of the oracle estimator

## Consequence for self-cal

The calibration accuracy achievable with blind calibration is identical to the accuracy achievable in calibration with DDEs common to all receivers

The recently developed theory of compressive sampling provides a tool to quantitatively understand the empirical (and sometimes surprising) self-calibration results from the past.