

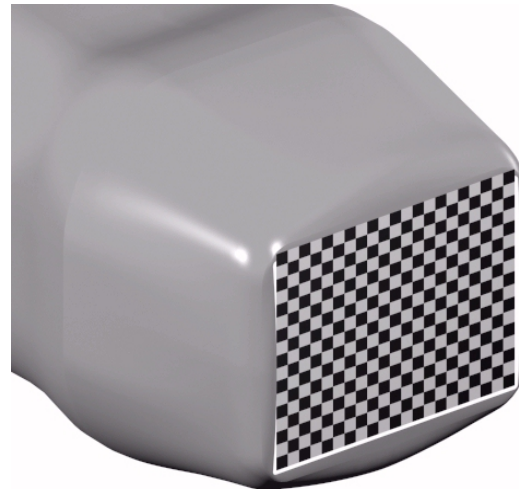


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# Experience with sparse arrays at the University of Oslo

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Multiple Beams and Reconfigurable Antennas  
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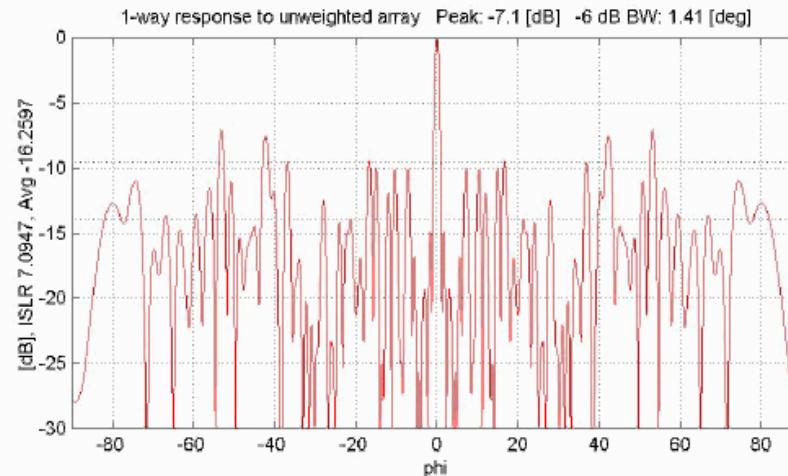
# Overview

- Building blocks in thinned arrays
  - Random arrays
  - Binned arrays
  - Periodic arrays
- Optimization of one-way beampattern
  - Linear Programming
  - Genetic algorithms
  - Simulated annealing
- Optimization of two-way beampattern
  - Different tx and rx layouts
- Non-flat arrays



# Random array

- Average array pattern = aperture weighted with pdf of thinning => Determines main lobe
- Normalized average sidelobe level  
 $1/K$
- Variance is about  $K$  for angles larger than  
 $|\sin \phi| > \lambda/L$   
 $L$  is the aperture.
- Peak sidelobe level
  
- Ex:  $K=25$ ,  $M=101$ , uniform pdf



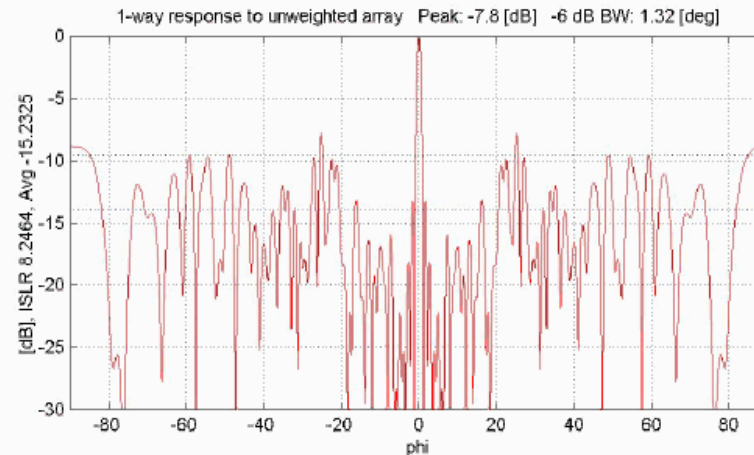
Thinning pattern (75.2% thinned):

```
10000000000001010000010100000010010100000000100100 1  
00000100010110000110000000110100100000010010000101
```



# Binned array / nearest neighbor restriction

- Divide array into  $K$  equal bins
- Select 1 element at random in each bin
- Max two neighbors
- Resembles random array, but variance does not reach full value until  $|\sin \phi| > K \phi \lambda/L$
- Ex:  $K=25$ ,  $M=100$ , bin size  $N=4$ ,
- i.e. low sidelobes for  $|\sin \phi| < 0.25$



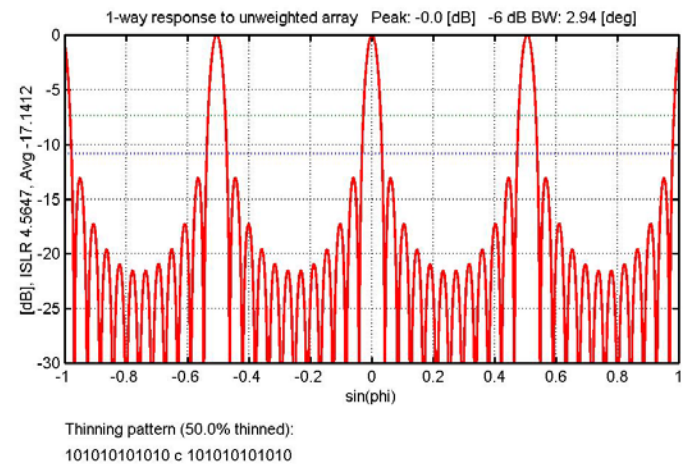
Thinning pattern (75.0% thinned):

```
10001000001000100001010000100001100010000010001010  
00010010000100001000100001000100101000001001000010
```



# Periodic arrays

- 1001001001, 101010101, 11001100 ...
- Grating lobes: position and size are easily predicted.
- Useful in imaging systems with different periodicities for tx and rx.
- Two-way beampattern = product of transmitter and receiver beampatterns.
- Grating lobes from tx are suppressed by the rx and vice versa.
- Special case: Vernier array which has periodicities  $p$  and  $p-1$ .



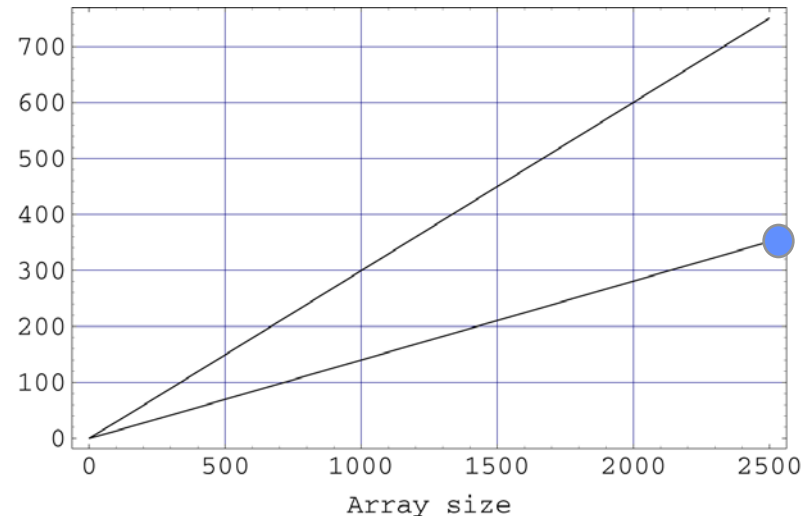


# Array thinning and full search

- Array with  $M$  elements and  $K$  active elements:

$$\binom{M}{K} = \frac{M!}{K!(M-K)!}$$

- $10 \log_{10}$  # combinations with 10% and 50% thinning
- **Example:**  $\sim 10^{358}$  for 250 elements out of 2500
- Number of electrons in universe:  $\sim 10^{80}$







# Optimization, reduction of search space

- 1-D array: end-elements always on to maintain aperture?
- Symmetry?
- Binned array
- Elements on a fixed grid or free element positions



# Linear programming

- Guaranteed optimal solution
- Our implementation: only symmetric arrays
- In practice
  - OK for 1D combinatorial problems
  - OK for 2D weighting problems



# Simulated annealing

- Speed improved with a method which is faster than FFT for beam pattern evaluation
- Only perturbs a single element at a time
- Subtract the contribution of the moved element and add the contribution of the new one
- All contributions from all elements at all angles are precomputed and stored in memory
- $N=256$  point evaluation: 6.7 times faster than FFT
- For larger  $N$ 's, the speed increase is even larger



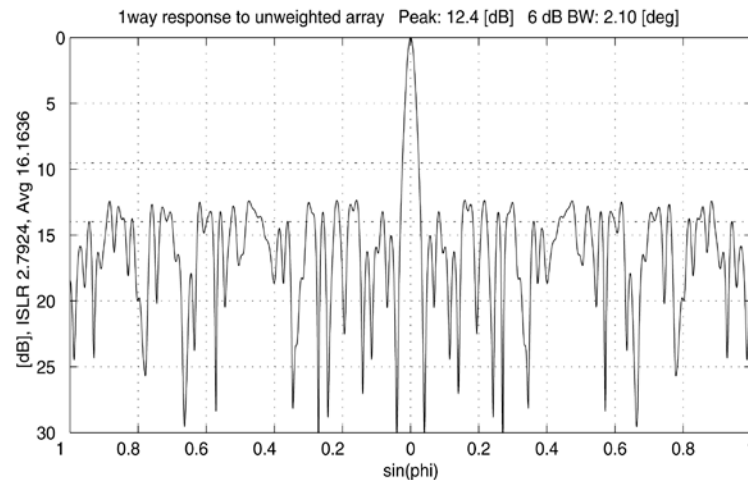
# Genetic algorithm

- Improved initialization over uniform probability distributions (first sidelobes around -13 dB)
- Cross-over does not significantly alter the pdf => pdf is still close to uniform.
- Too little randomness introduced by mutation.
- Better: Initialize search with density functions that already have desirable sidelobe properties.
- Improves convergence time and makes convergence to a good solution possible.
- Speed can be enhanced as simulated annealing, but requires much more memory as the responses of the whole population needs to be stored in memory.



# 1D array; simulated annealing thinning

- 25 elements from 101, classical thinning example
- Fixed end elements
- Lower CW peak than any published result, -12.36 dB
- MSc of J. F. Hopperstad
- Try it yourself – applet, [folk.uio.no/sverre](http://folk.uio.no/sverre), hi-score list



Thinning pattern (75.2% thinned):

```
10000001000000000000011110101000101101000010110011 0  
0011001000110000010010000000000000000000000000000001
```

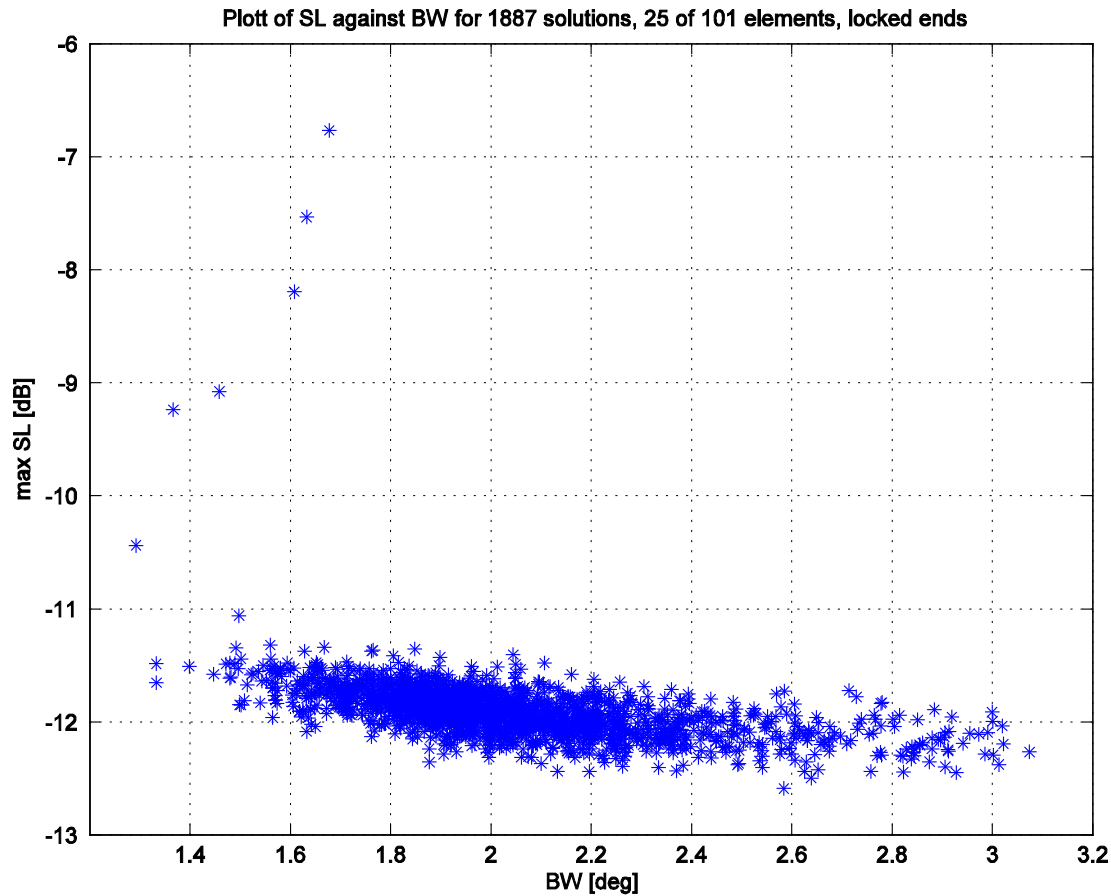


# 25 elements from 101, $\lambda/2$ , no weights

Min sidelobe	Method	Reference
-8.8 dB	Dynamic programming	Skolnik et al. <i>IEEE Trans. Ant. Prop.</i> , Jan. 1964.
-8.9 dB	Space-tapering	Lo & Lee, <i>IEEE Trans. Ant. Prop.</i> , Jan. 1966.
-10.14 dB	Dynamic prog.	Arora et al. <i>IEEE Trans. Ant. Prop.</i> , July 1968.
-12.07 dB	Simulated annealing	Murino, Trucco, Regazzoni, <i>IEEE T. Sign. Proc</i> , Jan. 1996.
-12.36 dB	Simulated annealing, fixed ends	Hopperstad, MSc thesis, Univ. Oslo, May 1998.
-12.42 dB	Simulated annealing, no conditions on ends	Austeng, Holm, IEEE NORSIG, Oct. 2002.
-12.54 dB	Simulated annealing, Java applet	Steinar H. Gunderson, NTNU, 2007
-14.09 dB	Simulated annealing, Arbitrary el's, lim. steering	Austeng, Holm, IEEE NORSIG, Oct. 2002.



# Peak sidelobe vs. beamwidth





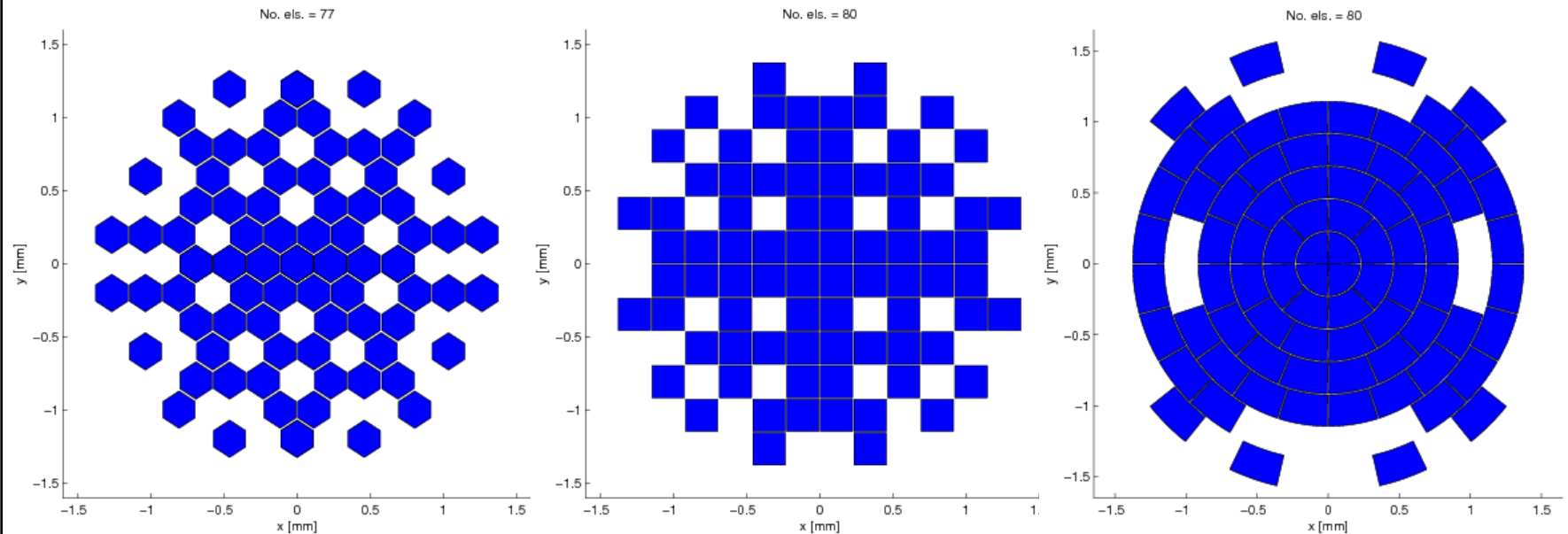
# Parallel optimizations

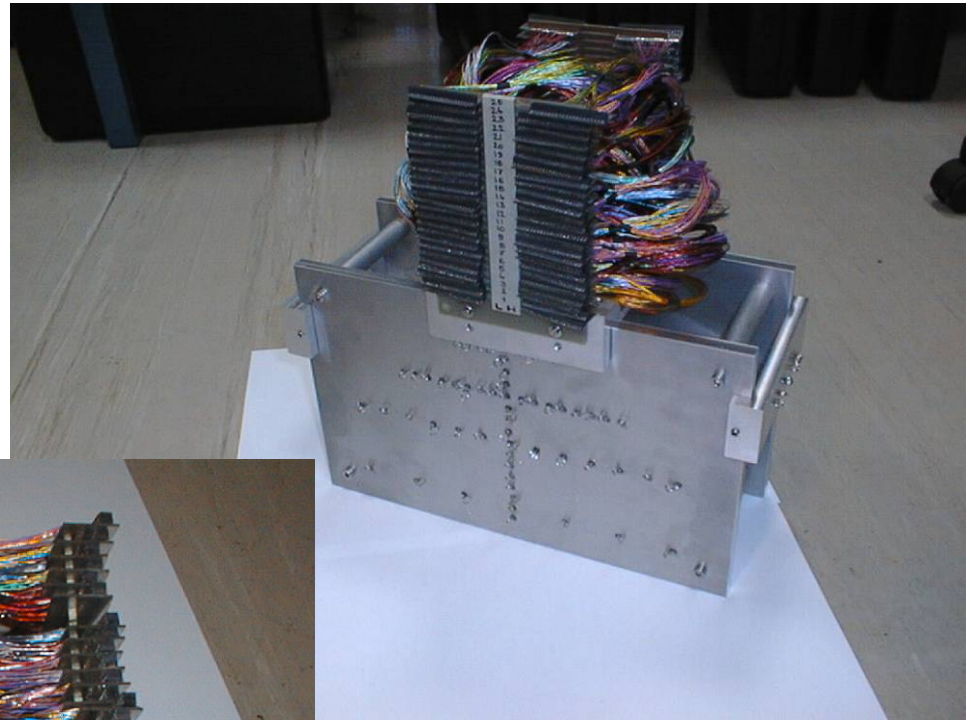
- 25 ... 69 elements out of 121, i.e. 45 different config's
- Purpose: find lower limit on peak sidelobe level
- For each: 2000 indep. sim. annealing combinatorial optimizations, each with 800 000 beam patterns
- $45 * 2000 * 800\ 000 = 7.2 \text{ e}10$  beam patterns
  
- Condor: High Throughput Computing (HTC) on large collections of distributed computing resources.
- Up to 240 desktop computers, in practice 100 – 200 in use at the same time
- Throughput: about 1000 optimizations per hour
- Svein Bøe





# Sim. anneal for arbitrary layouts

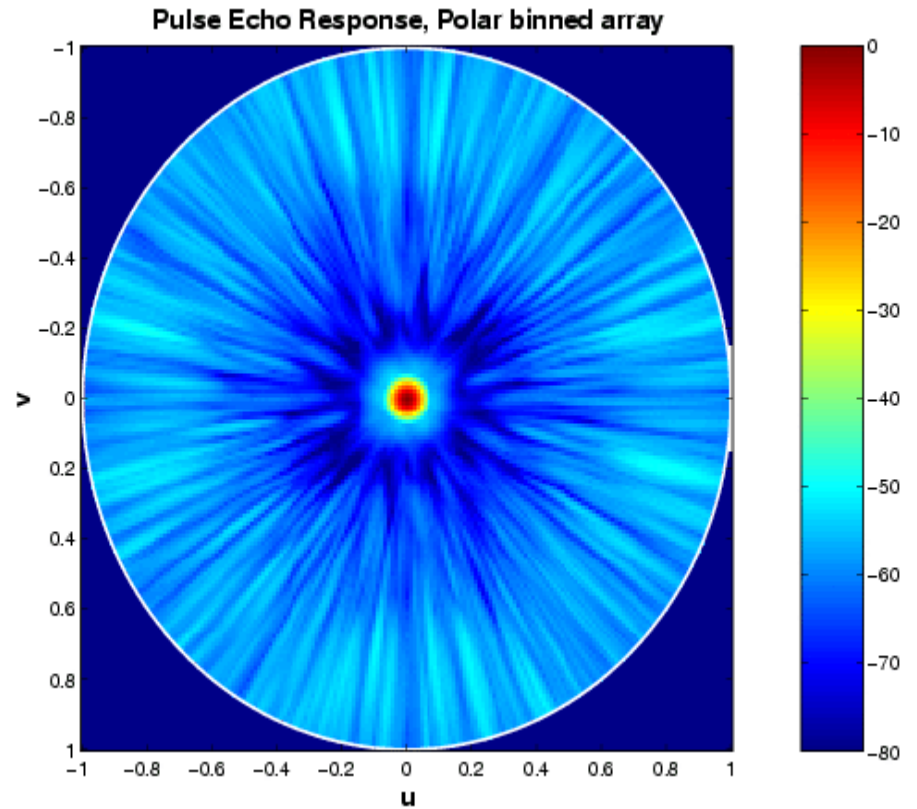
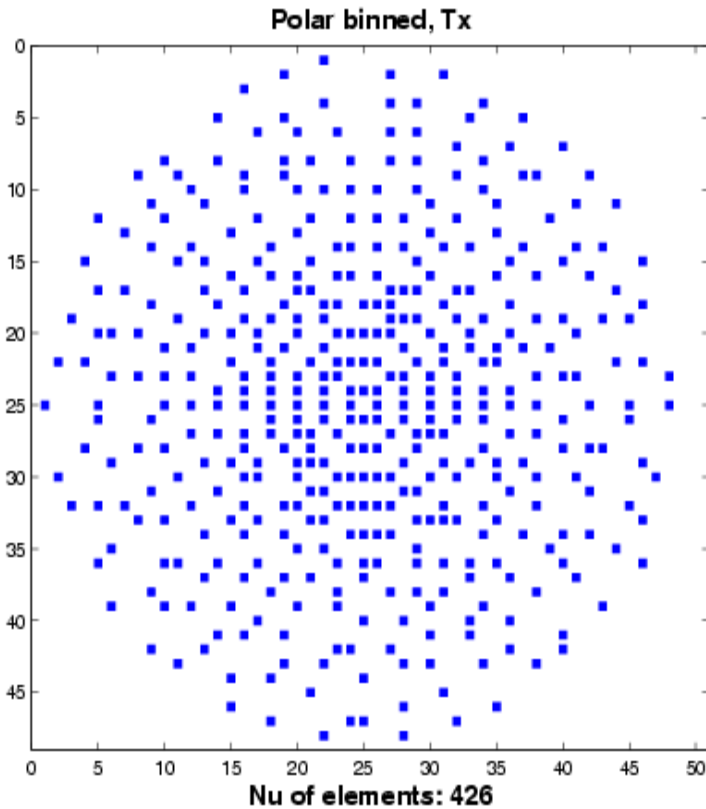




50 x 50 element array  
from Thomson Micro-  
sonics (IEEE Ultrason.  
Symposium, 1998)

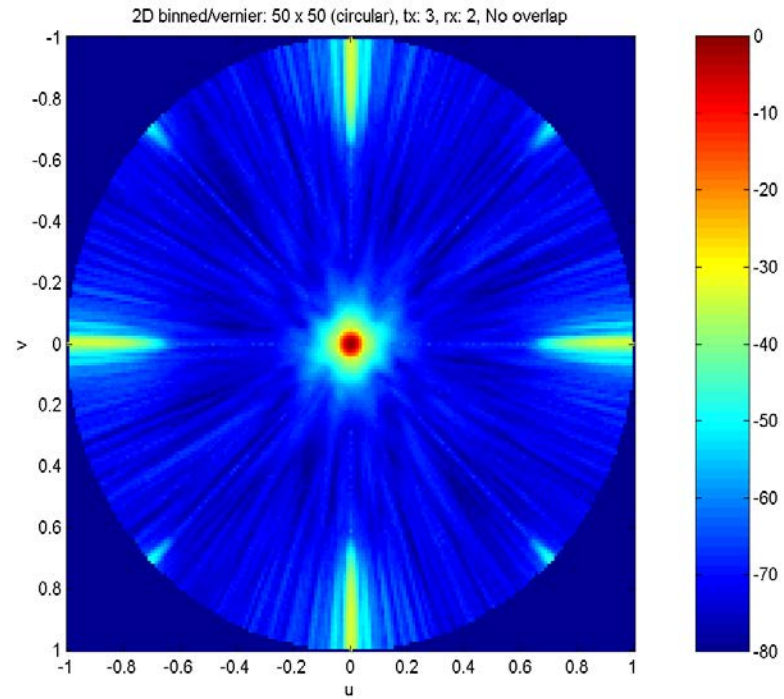
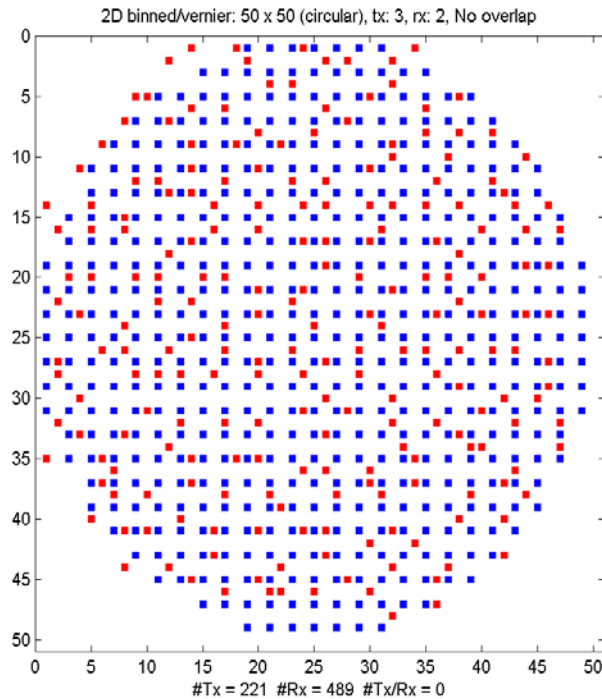


# Binning in a polar pattern (Rx=Tx)





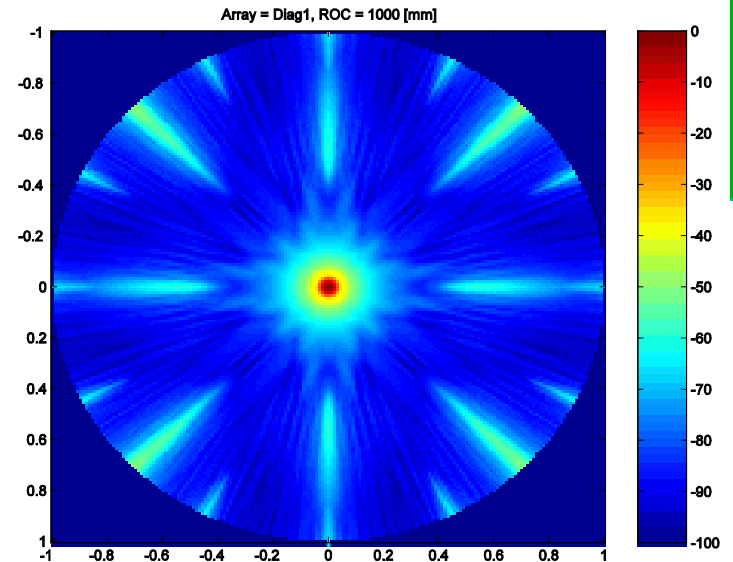
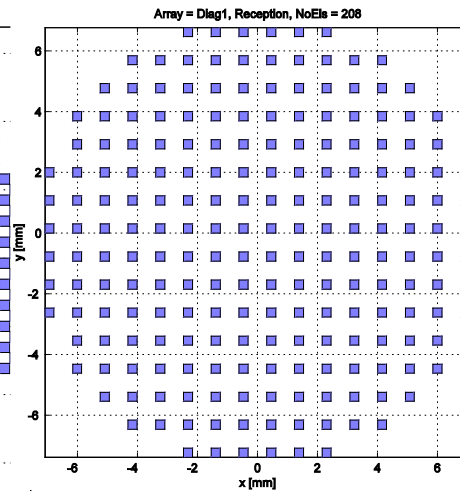
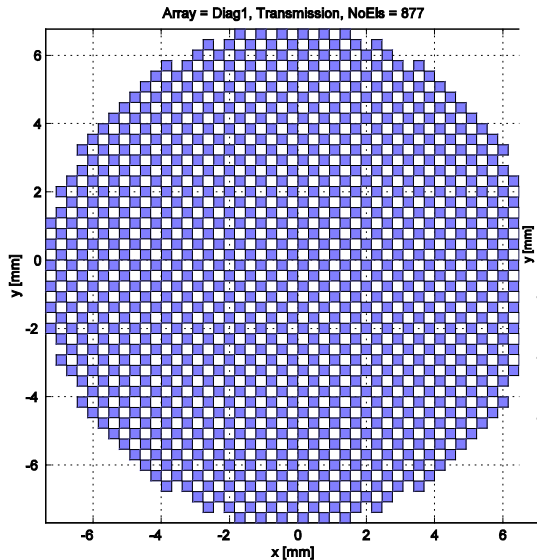
# Periodic + binned 489 Rx, 221 Tx : no overlap





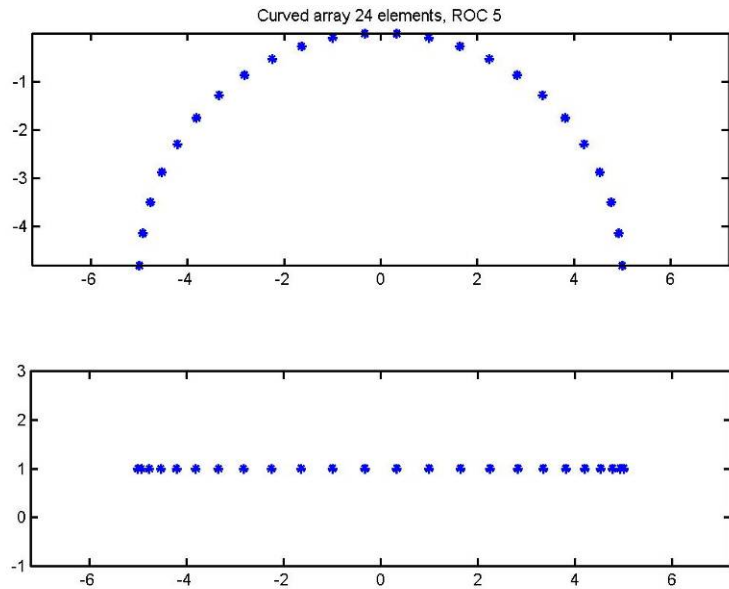
# Diagonal periodic tx, periodic rx

Diag1 array, Tx = 877 els., Rx = 208 els., max. SL. = -50 dB





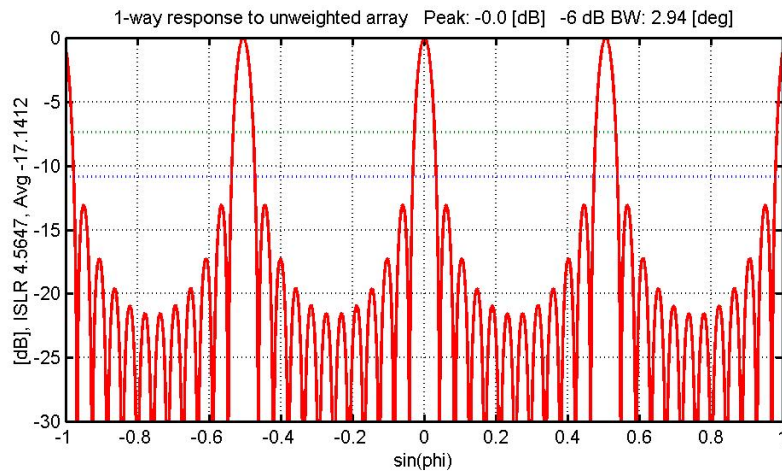
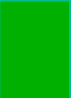
# Element shadowing property



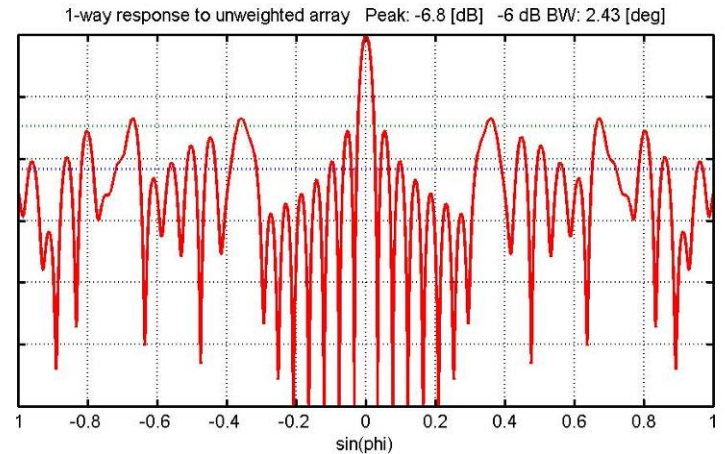
- Beampattern is given by Fourier transform of projection
- Curving breaks the periodicity



# Grating lobes: Curved vs. Linear



Thinning pattern (50.0% thinned):  
101010101010 c 101010101010



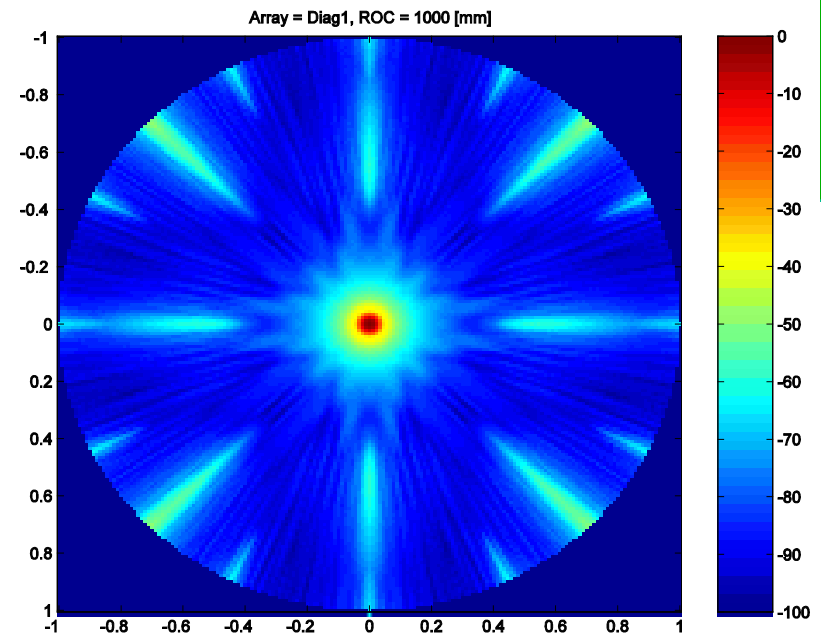
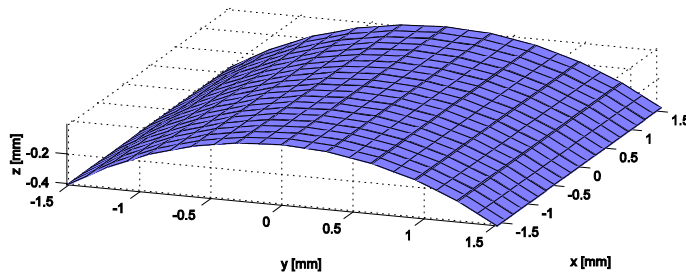
Thinning pattern (50.0% thinned):  
101010101010 c 101010101010

24 elements over 23.73 lambda aperture/chord, 50% periodic thinning



# Periodic arrays suitable for curving

- When curved in one direction, grating lobes at angles other than those orthogonal to the curving are suppressed.
- Curving along y-axis  
=> Periodicity along diagonals.







# Conclusions

- Building blocks: Random, random binned and periodic arrays
- Linear programming, genetic methods and simulated annealing.
- Preference for simulated annealing method
- Examples:
  - ULA, 2D uniform flat array
  - Optimized arrays on non-Cartesian grids such as polar and hex.
  - Non-planar arrays (curved and cylindrical) have also been optimized.
- Are working on establishing an empirical lower limit on peak sidelobe level for a given array with a given percentage of thinning.



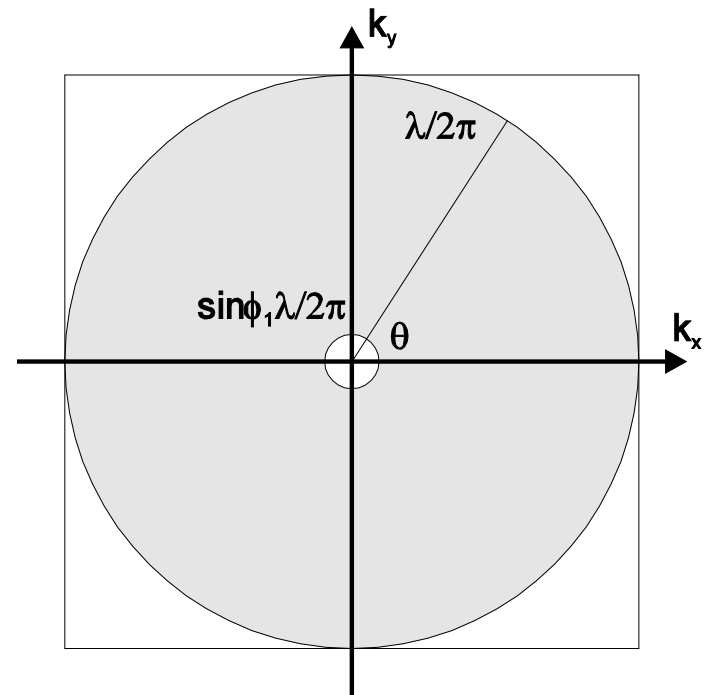


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# Steered vs. unsteered arrays

- Unsteered:
  - Optimization  $\Rightarrow$  the sidelobe level should be minimized over all visible angles.
  - Annular region since  $(k_x, k_y) = 2p/\lambda^*(\sin\phi \cos\theta, \sin\phi \sin\theta)$
  - Sampling  $\Rightarrow$  beampattern will be repeated for argument of  $k_x$  and  $k_y$  larger than  $2p/\lambda \Rightarrow$  annulus will repeat along the  $k_x$ -axis and the  $k_y$ -axis.
  - With element distance  $\lambda/2$ , the circles will exactly touch.
- Steering:
  - The visible region will have its center at the steering direction, while the optimized region from the array is still centered at the origin.
  - May no longer have full overlap between the optimized region and the visible region.
  - One must optimize a larger region
  - With element distance  $\lambda/2$ , and for all possible steering angles, one must optimize over the square region.





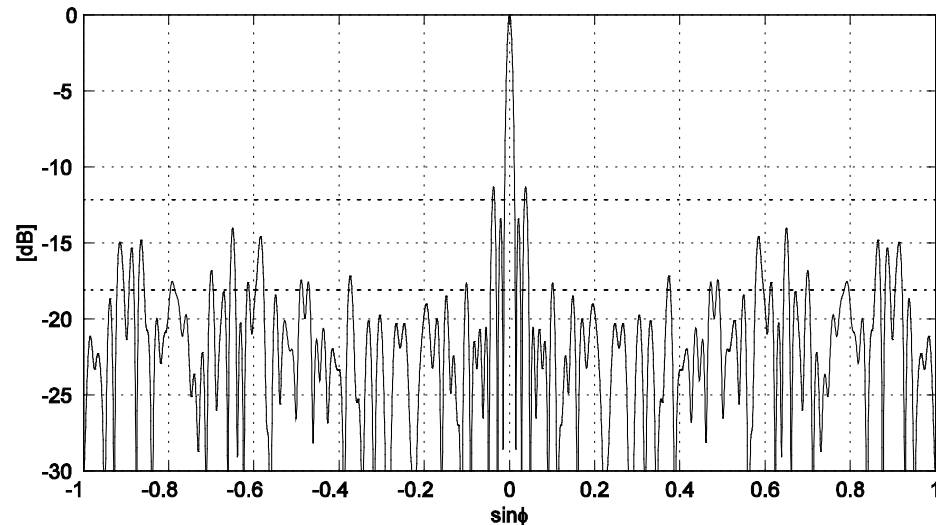
# Optimization criterion

- **Criterion 1: Minimum max sidelobe**
  - Weighting: Dolph-Chebyshev
  - Good for discrete targets in non-reflecting background
  - Restriction on maximum mainlobe width
- **Criterion 2: Minimum sidelobe energy**
  - Weighting: Prolate-spheroid  $\frac{1}{4}$  Kaiser-Bessel
  - Related to image contrast
  - Restriction on peak sidelobe and/or mainlobe



# Random array

- Average array pattern = aperture weighted with pdf of thinning.
- Determines the main lobe
- Uniform thinning:
- Average sidelobe power to main lobe power is  $1/K$ .
- Variance is about  $K$  for  $|u| = |\sin \phi| > \lambda/L$ ,  $L$  is the aperture.
- Relative peak level of a 1D random array is  $\sqrt{K \ln K}$
- Ex:  $K=64$  selected from  $M=128$ , uniform density

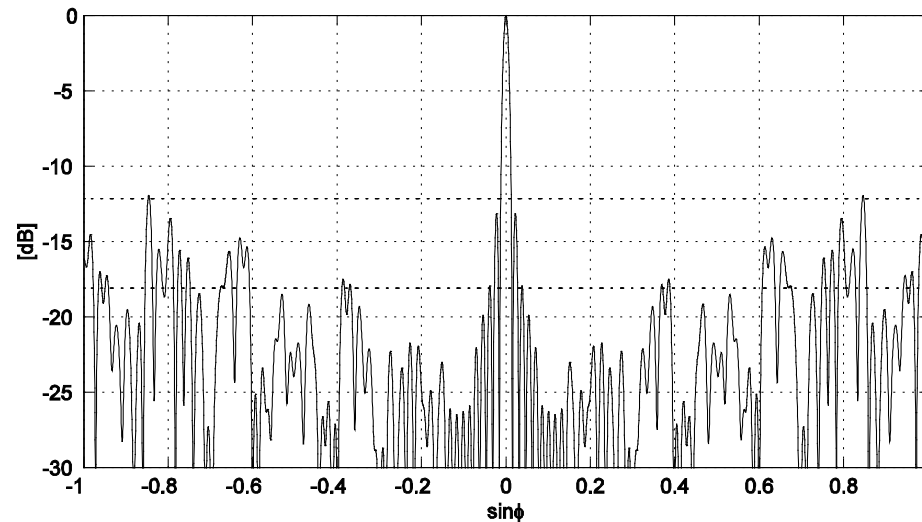


Thinning pattern (50.0% thinned):  
1101110101100100111101100010111010000100011000101010110100111111  
0010110010011001010110100010000010010110001101010110101011011001



# Binned array

- Aperture is divided into  $K$  equal size bins and one element is chosen at random in each bin.
- No more than two neighbor elements in a 1D binned array.
- Resembles random array, but variance does not reach  $K$  until  $|u| = |\sin \phi| > K \lambda/L$ .
- Close-in sidelobes are much lower than the random array
- Ex:  $K=64$  selected from  $M=128$ , bin size 2, uniform



Thinning pattern (50.0% thinned):

```
0110101010011010101010101001011010101001101001100110  
1001011001100101011010010101011010011001011001011010100110
```