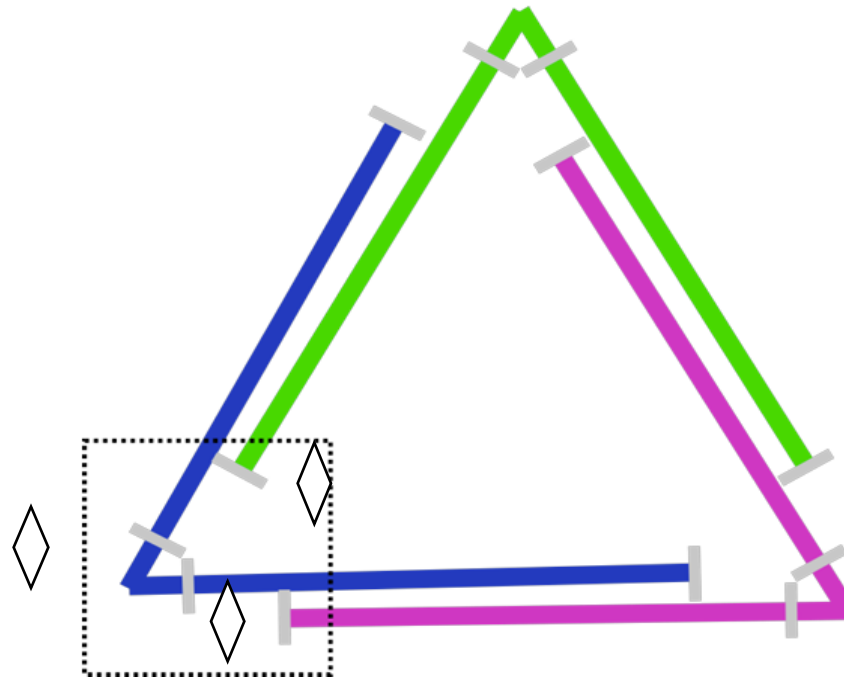


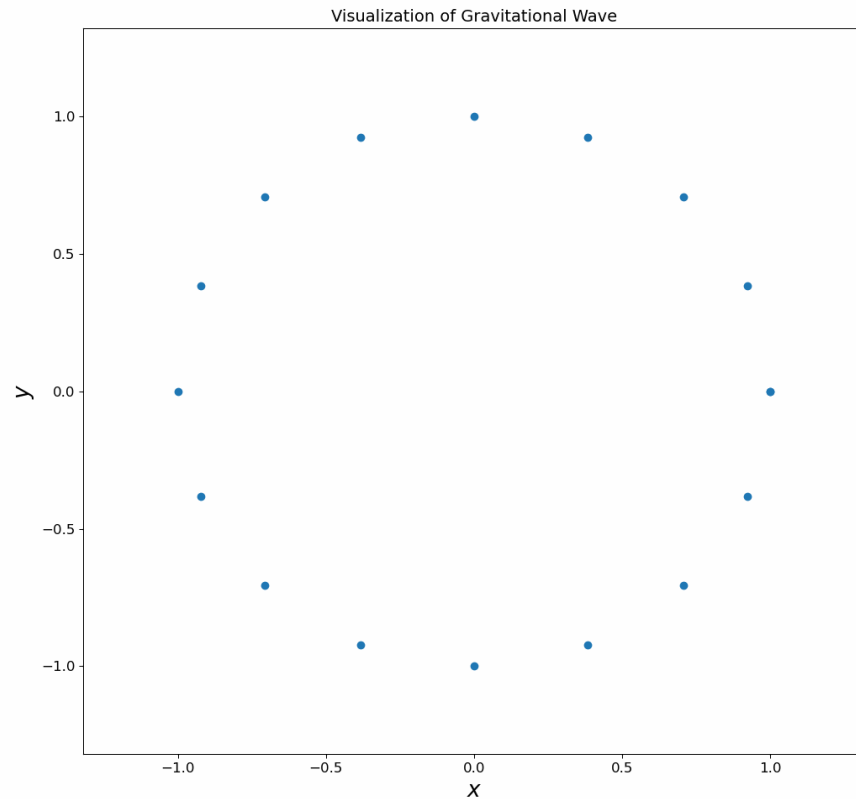
Seismometer Position Optimization for Newtonian Noise Mitigation in the Einstein Telescope



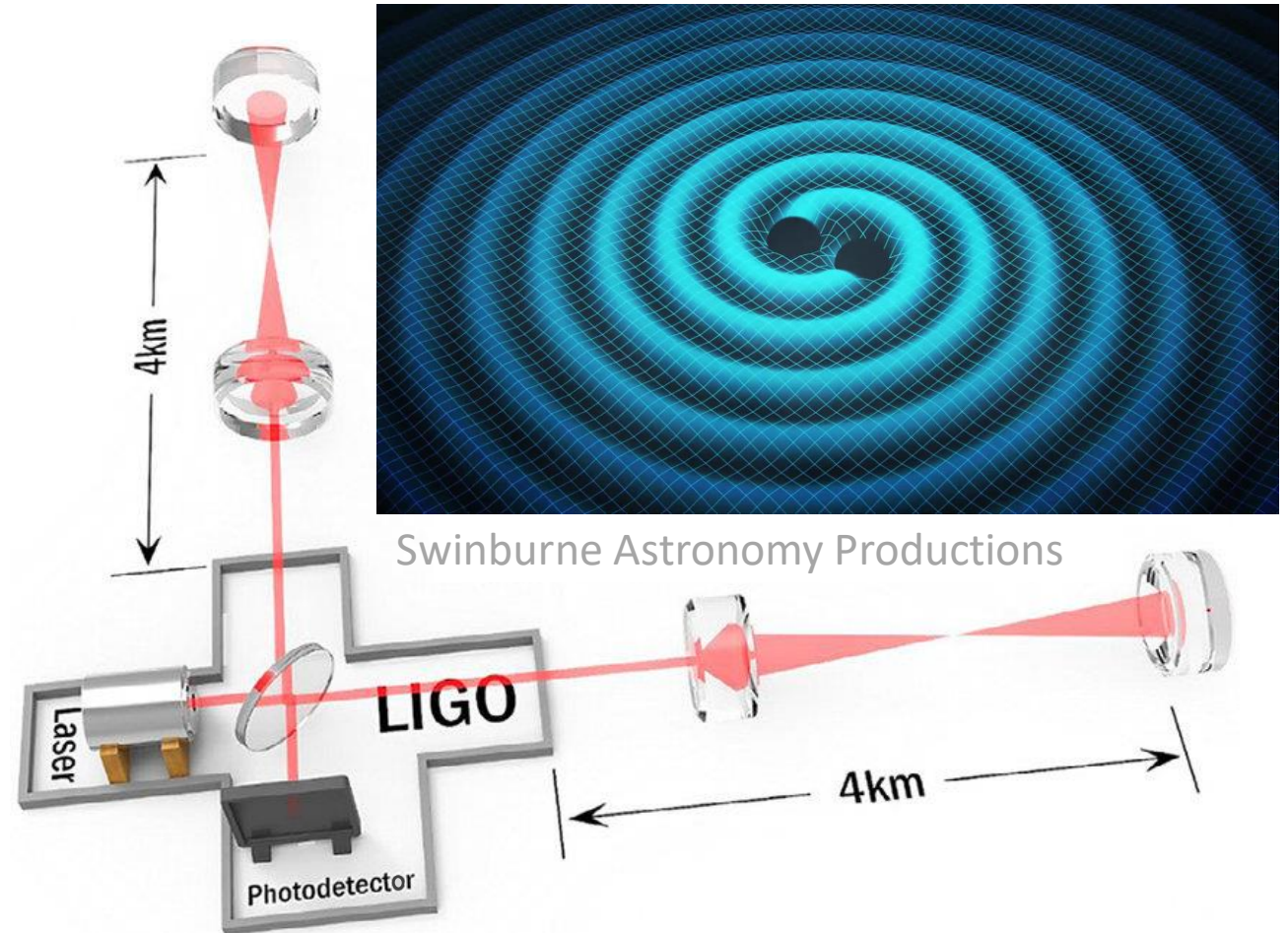
Introduction

What is the Einstein Telescope and why do we want to place
seismometers?

How to Measure Gravitational Waves

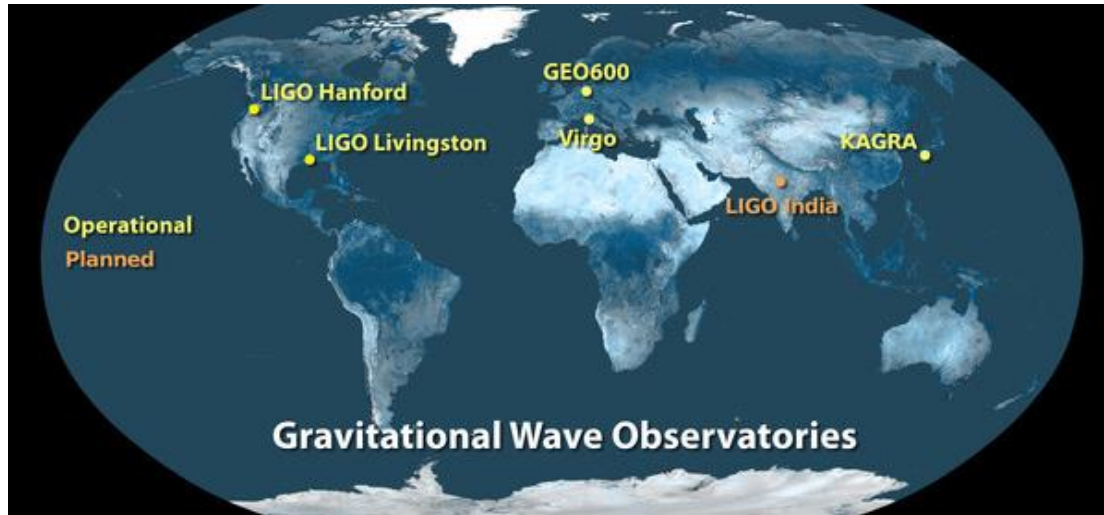


$$\text{Strain } h = \frac{\Delta L}{L}$$



Chao Zuo et al. (2020)

LIGO, Virgo and Kagra

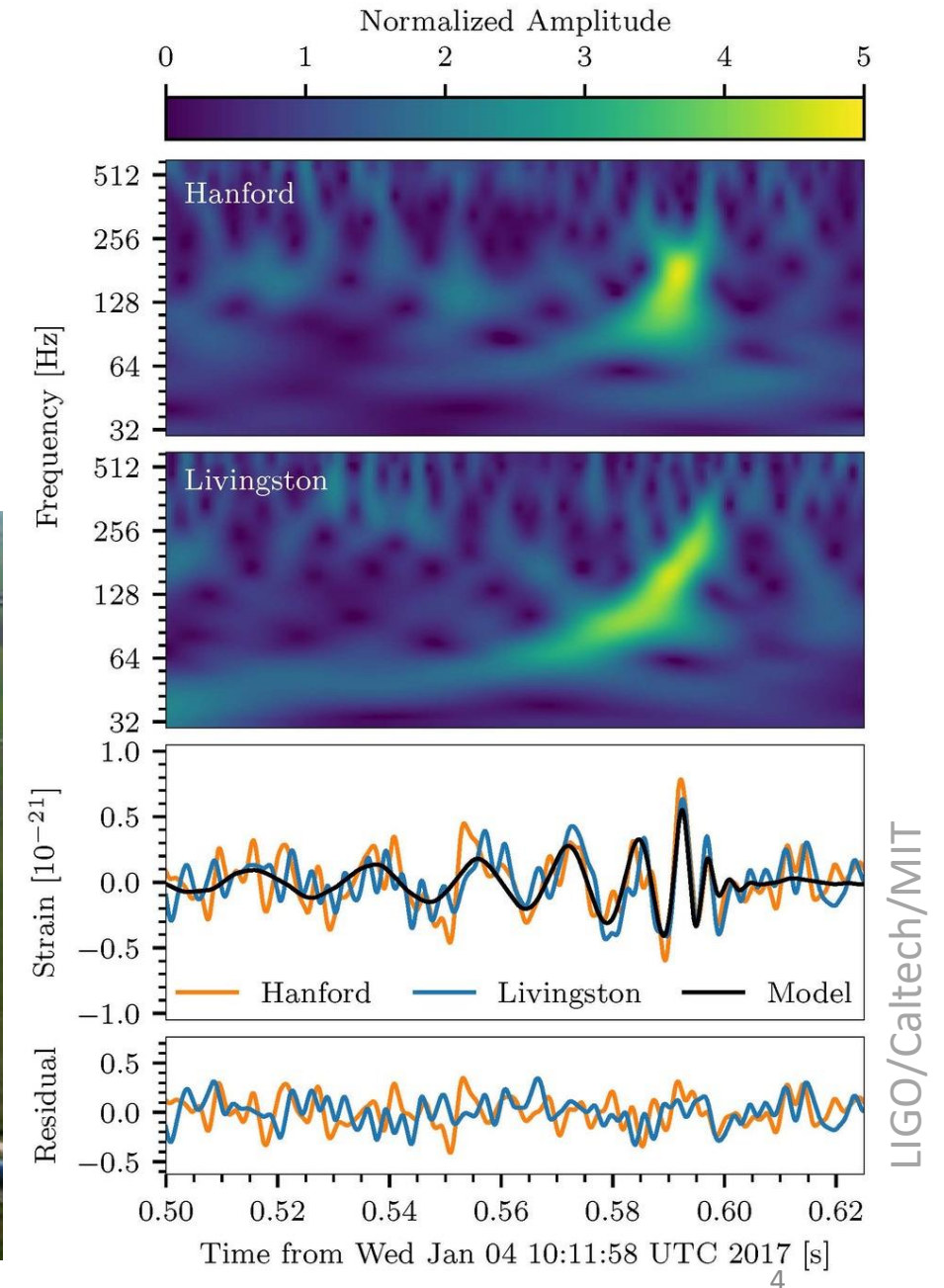


Caltech/MIT/LIGO Lab

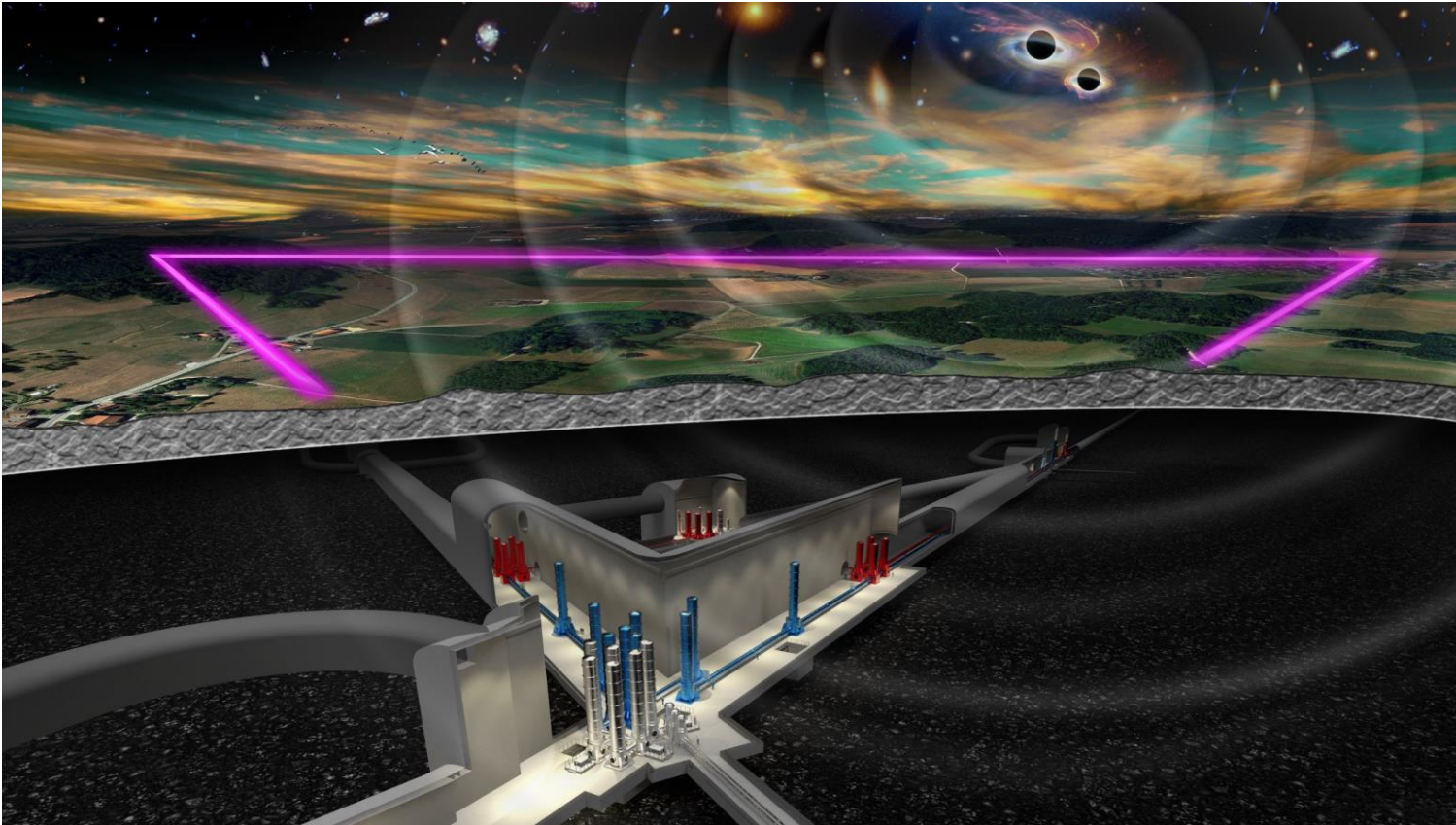


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Virgo collaboration/CCO 1.0

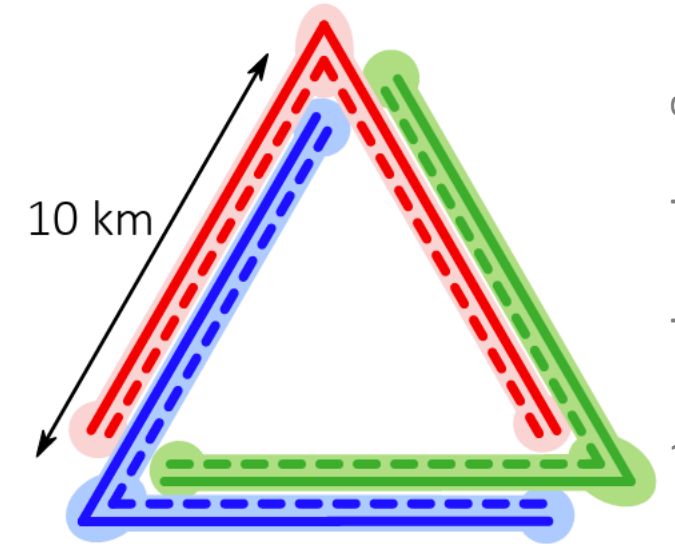


The Einstein-Telescope

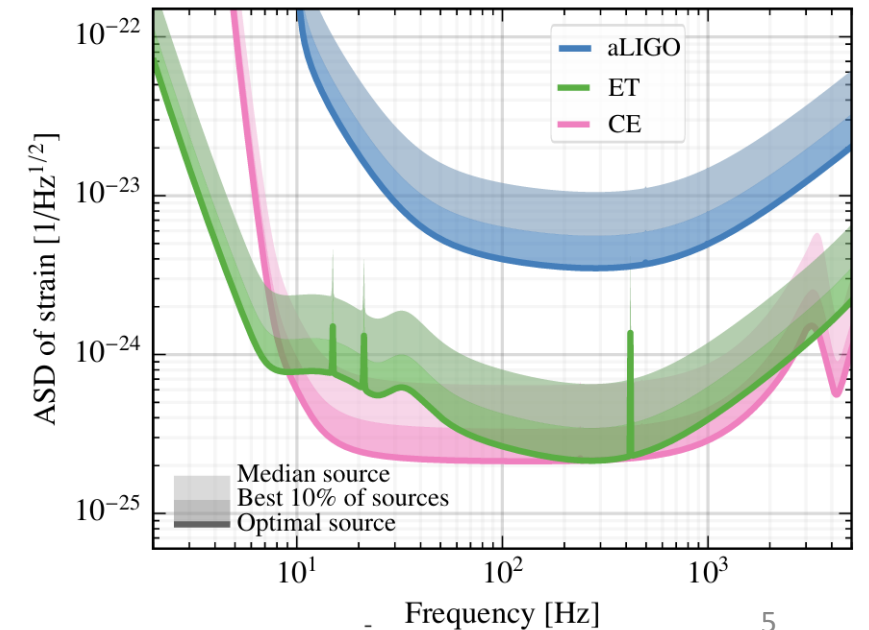


Marco Kraan, Nikhef

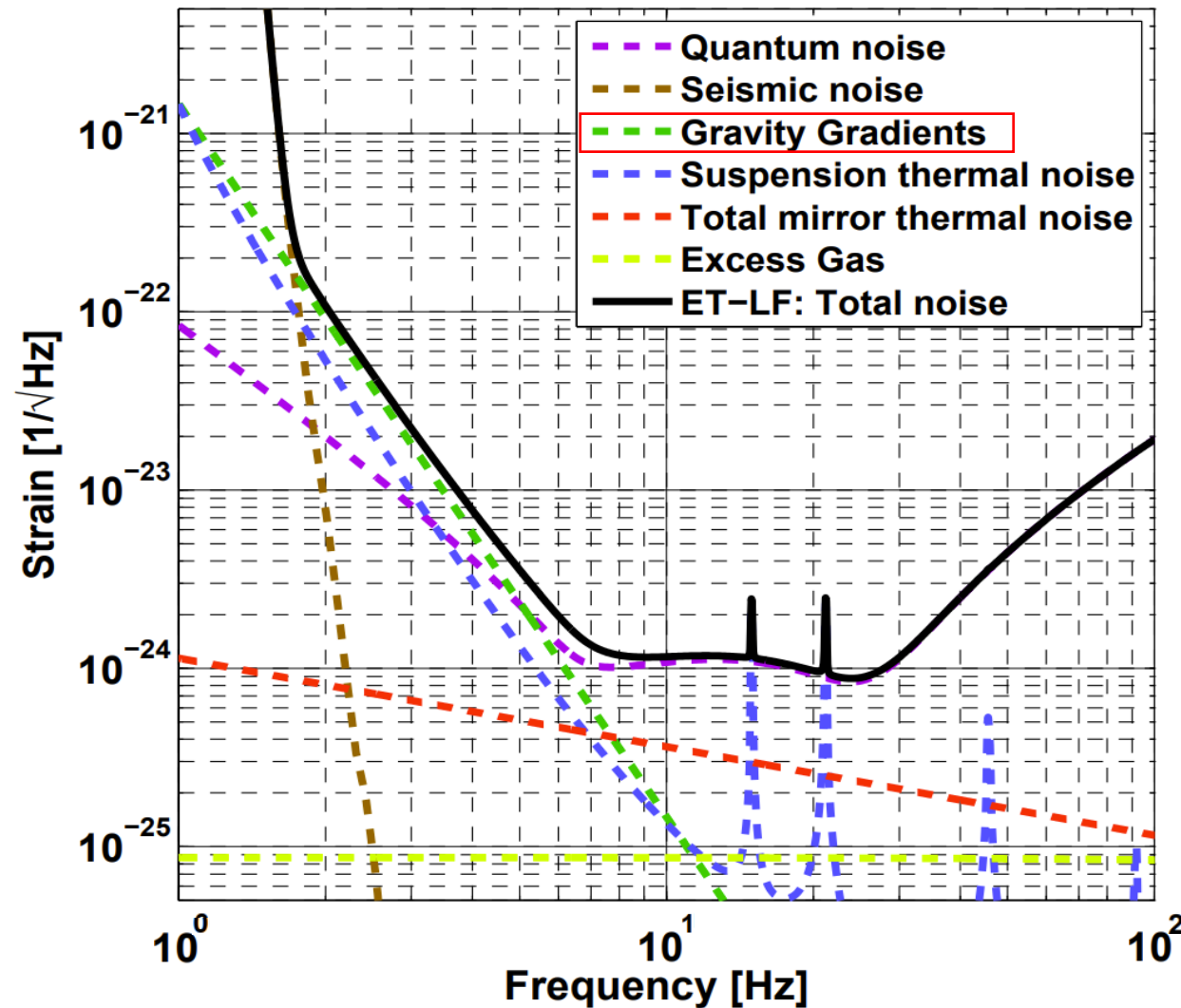
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ET design report update (2020)

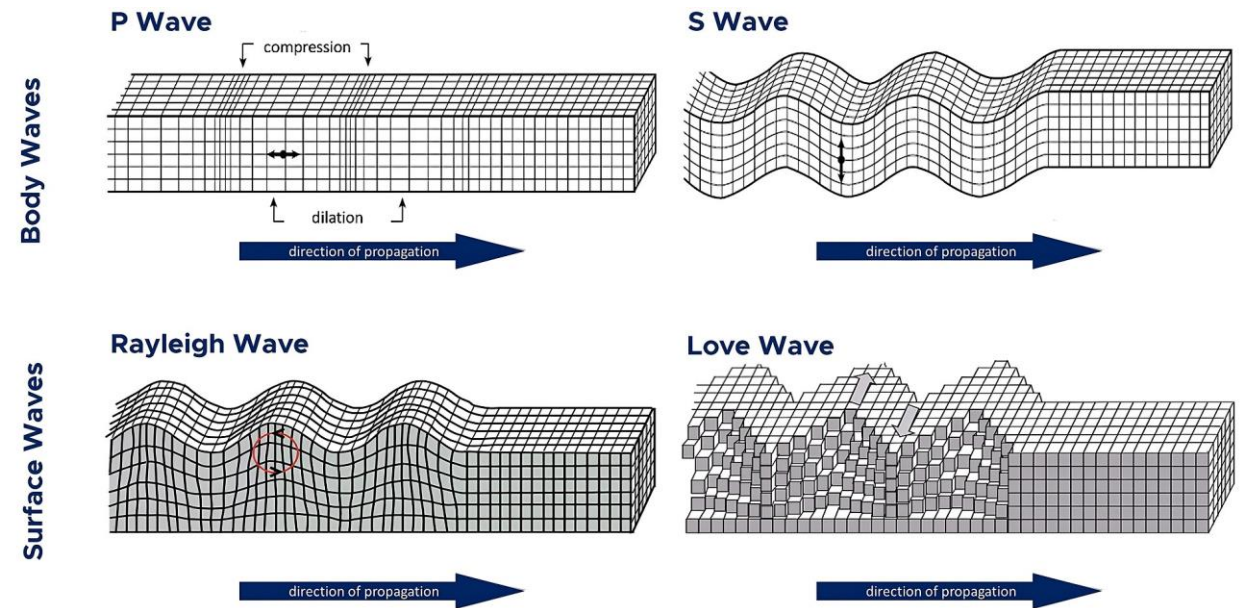
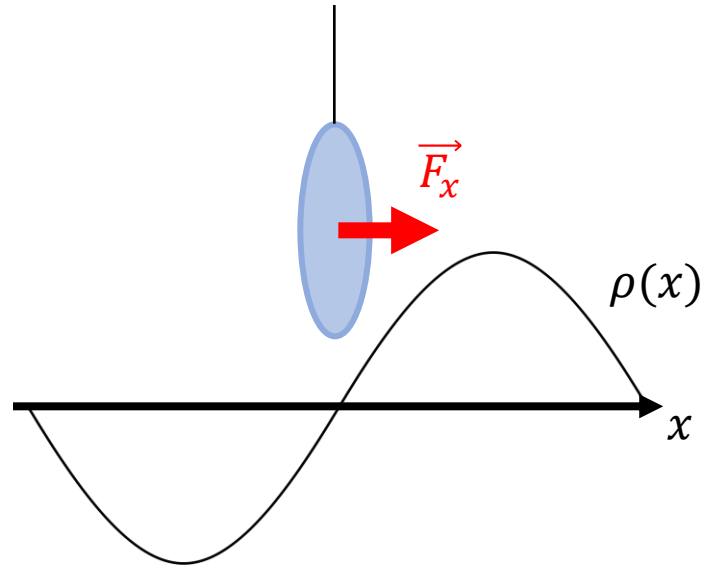


Einstein telescope's limiting noise curve



Hild et al., arXiv:1012.0908

Newtonian Noise

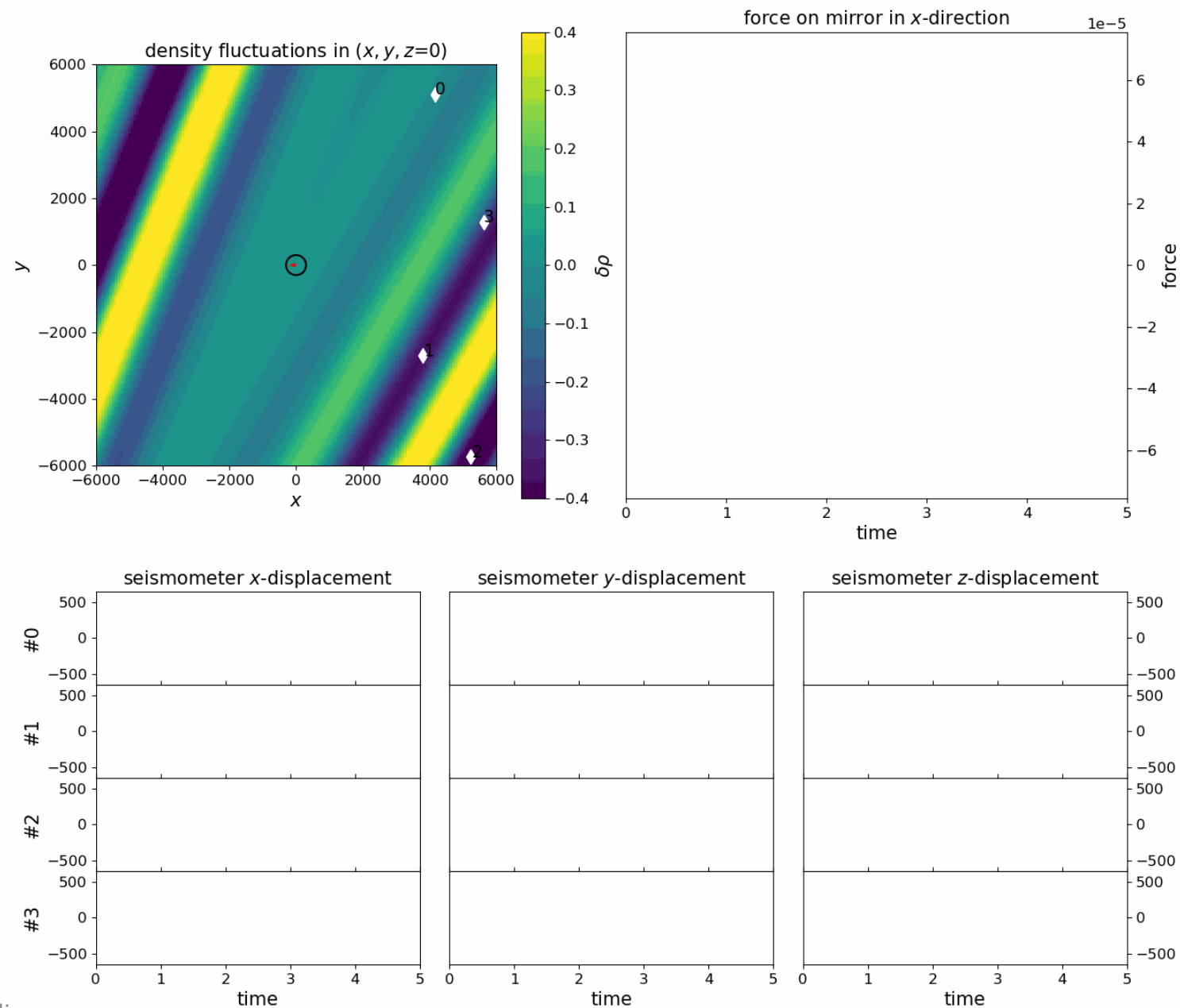


B.A. Bolt, Textbook (1982)

- Density fluctuations in the Earth couple gravitationally to the ET mirror

- Cannot be shielded: Must be predicted and subtracted
 - Boreholes for seismometers are expensive
- Optimize seismometer positions

Density Fluctuations, Force and Seismometer Data at $t = 0.0$

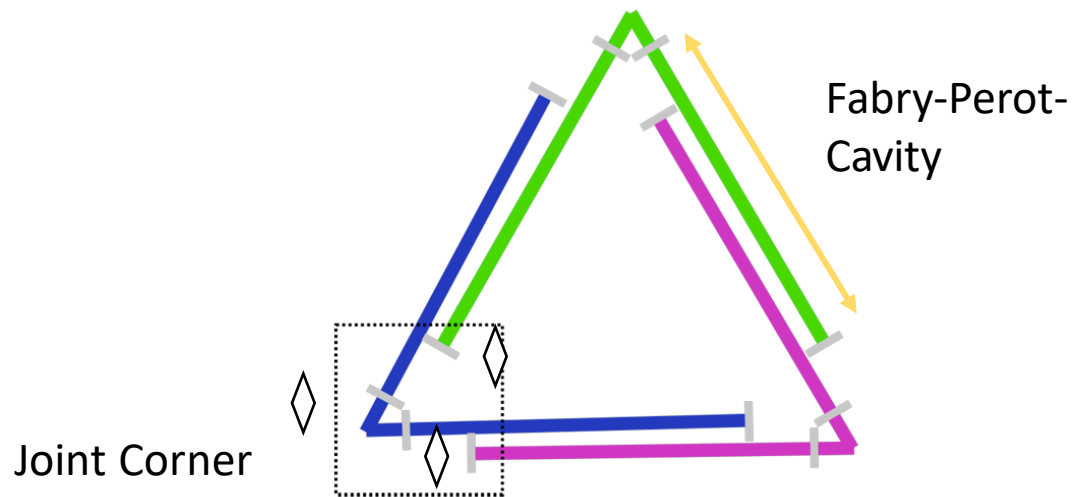


Wiener Filter

Signal estimate

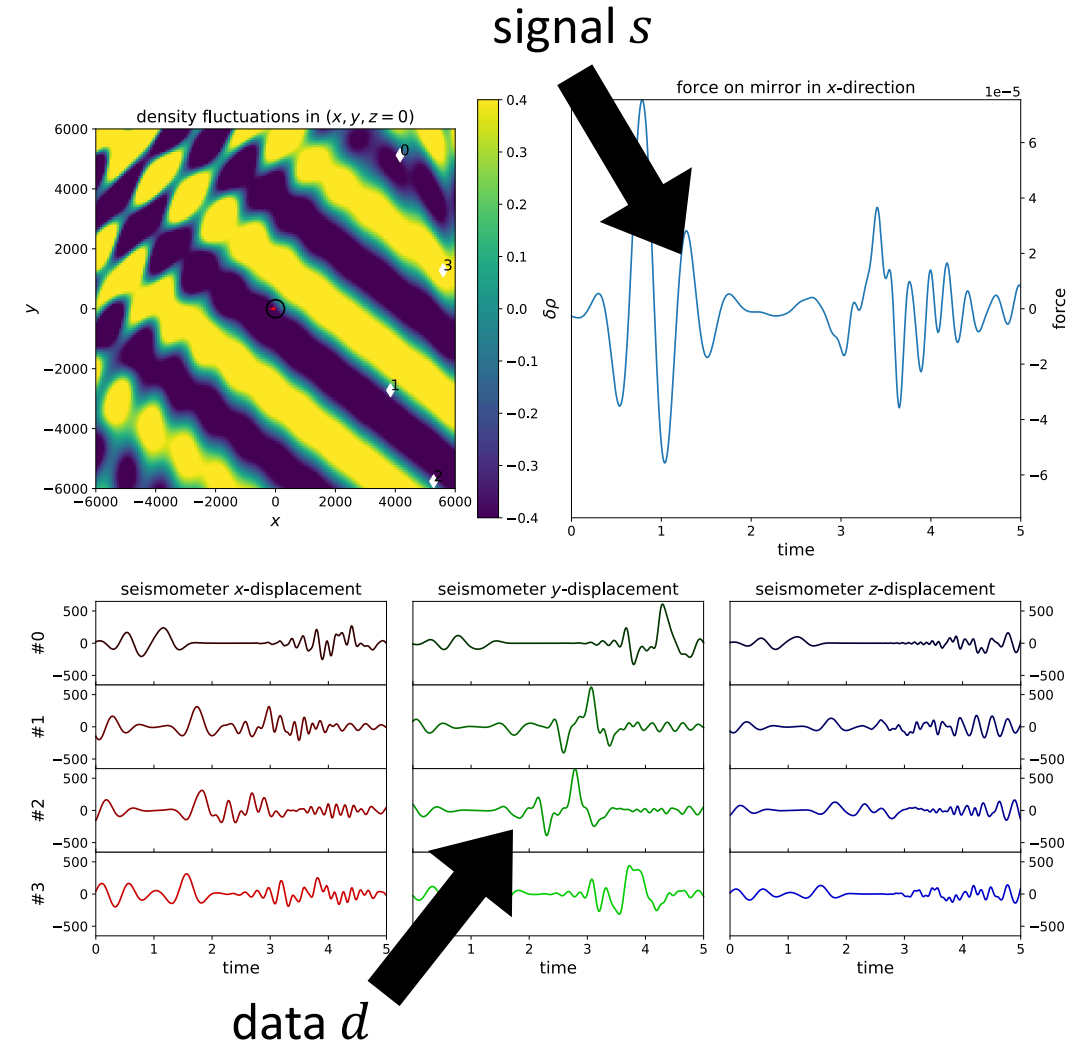
$$\tilde{s} = W \cdot d \quad \text{with} \quad W = \langle s d^\dagger \rangle \langle d d^\dagger \rangle^{-1}$$

$$\text{Residual } R(\omega) \equiv \frac{E[(s - \tilde{s})^2]}{E[s^2]} = 1 - \frac{\vec{c}_{ds}^\dagger \cdot C_{dd}^{-1} \cdot \vec{c}_{ds}}{c_{ss}}(\omega)$$



Assumptions: homogeneity, isotropy, plain waves
→ analytical result

Minimize $\max(R(\omega))$ for the four mirrors

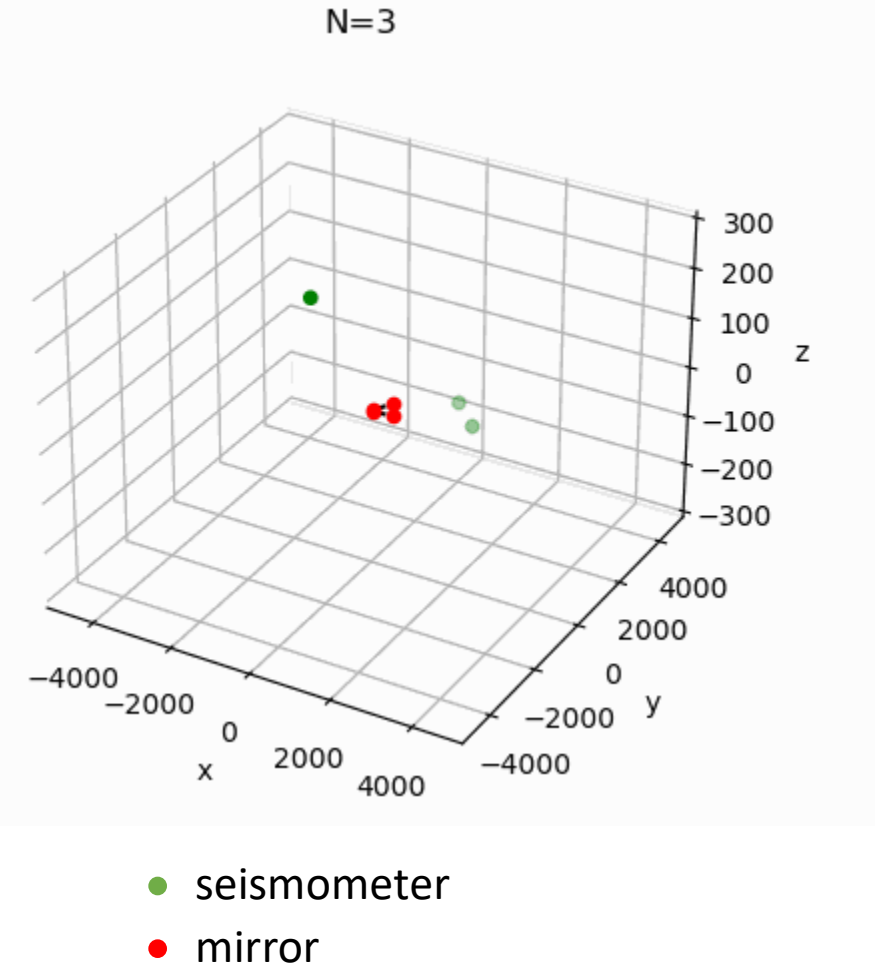


Optimization Algorithm

→ Particle Swarm Optimization
(general, fast and reliable for small N)

Parameter (benchmark value/range):

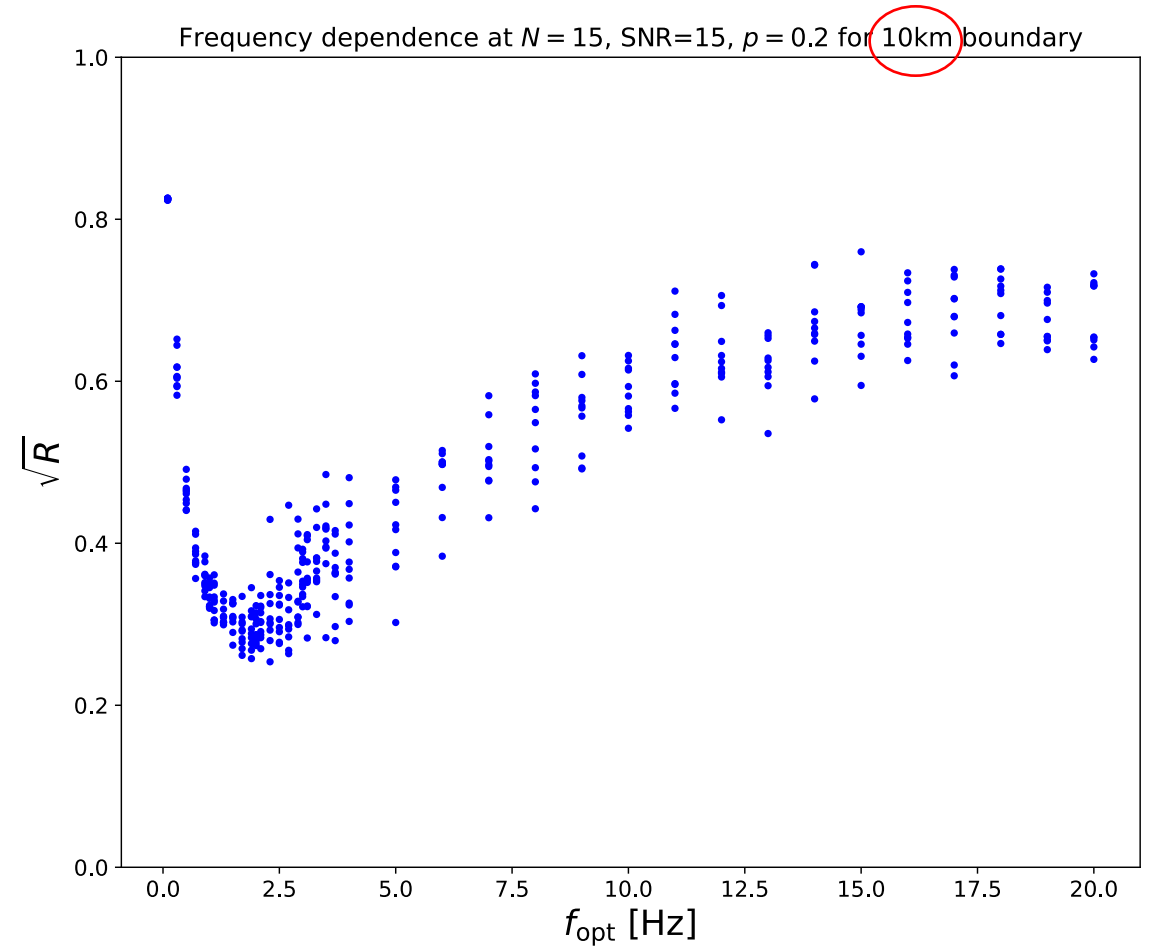
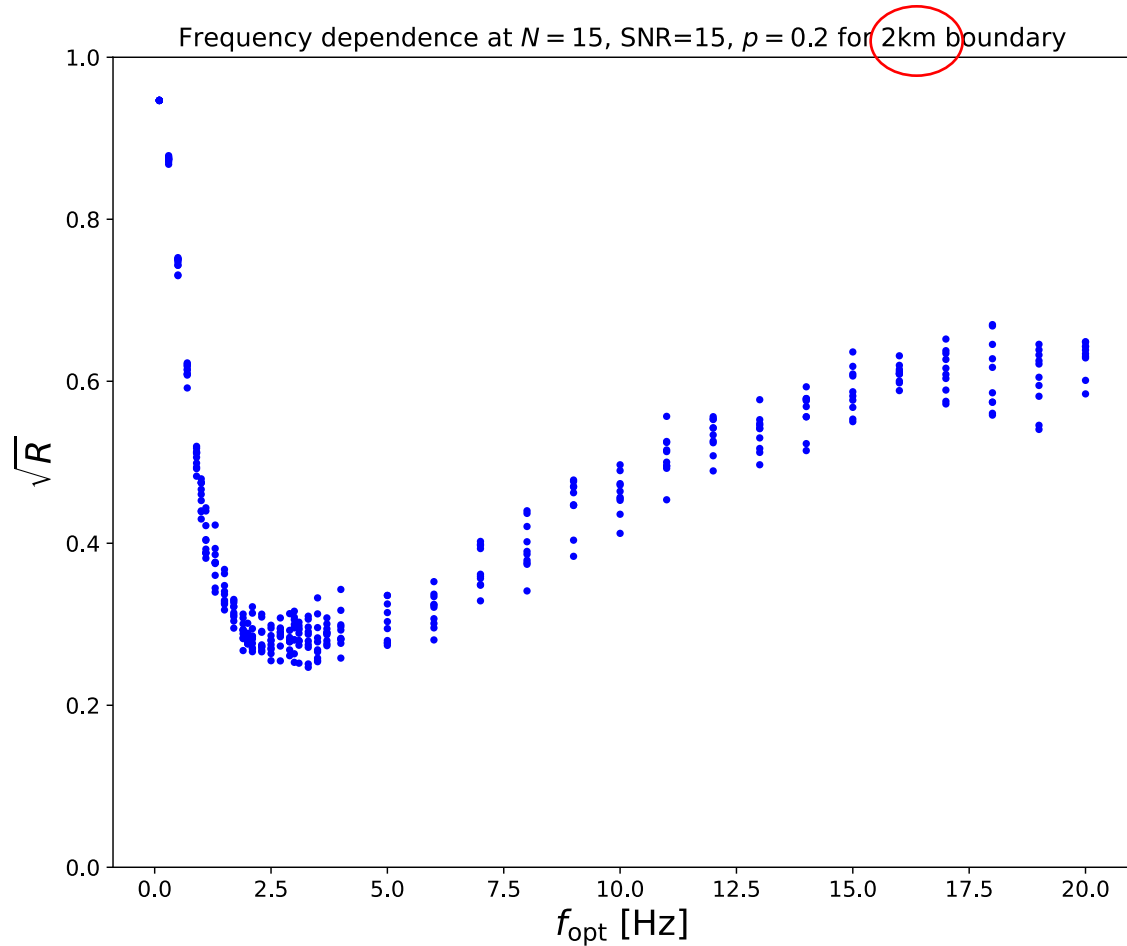
- Number of Seismometers N (15/1-100)
- Signal-to-Noise-Ratio of operating seismometers SNR (15/1-30)
- Optimization frequency f (1 Hz/1-20 Hz)
- Ratio of P- and S-waves p (0.2/0-1)



Parameter Studies

What influence do the different parameters have?

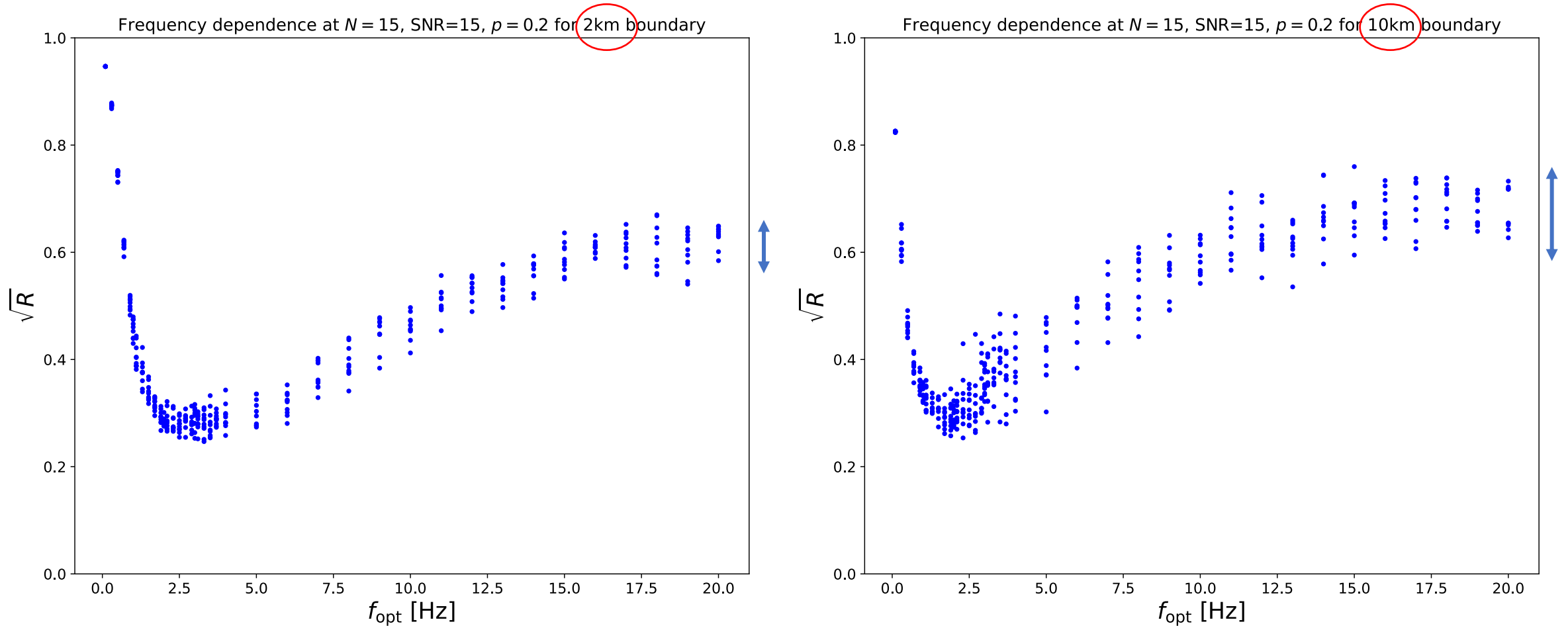
Boundary Dependency



- Seismometers need space to predict low frequency Newtonian Noise

Boundary Dependency

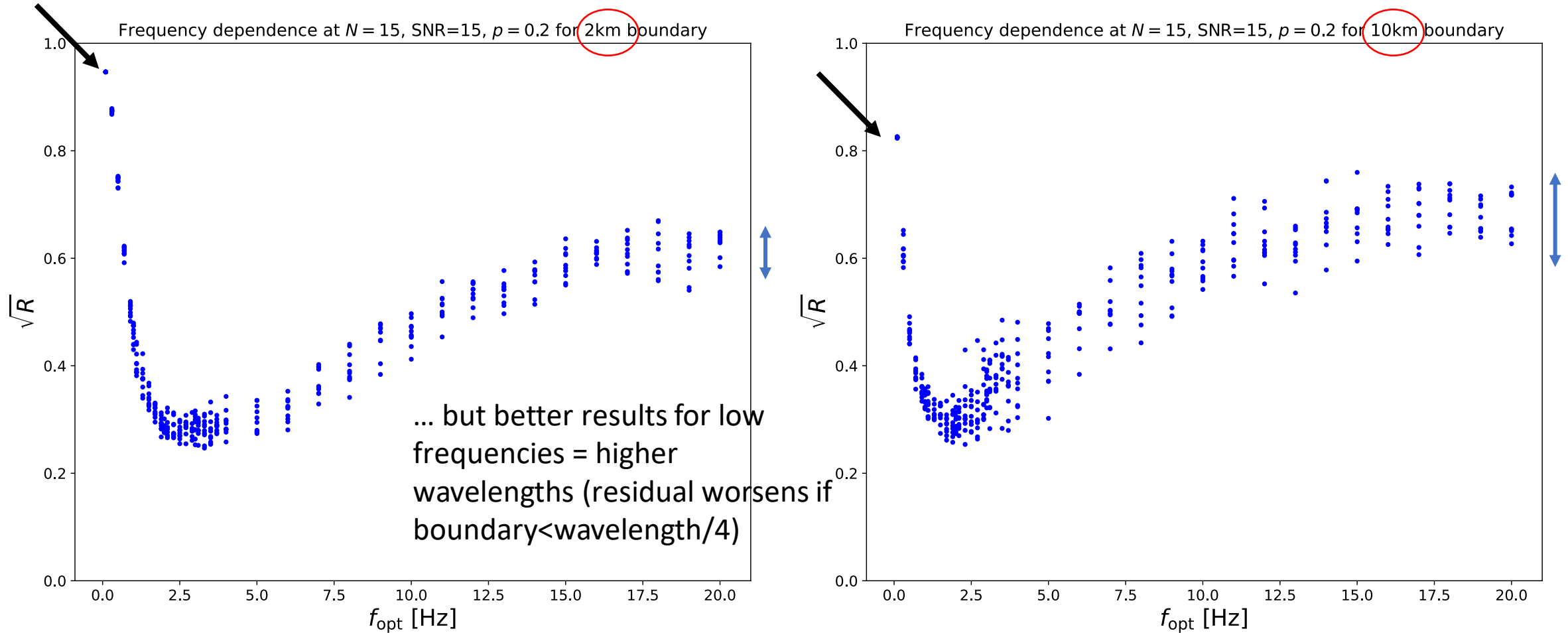
Larger spread and higher residuals due to worse convergence of PSO in larger volume...



- Seismometers need space to predict low frequency Newtonian Noise

Boundary Dependency

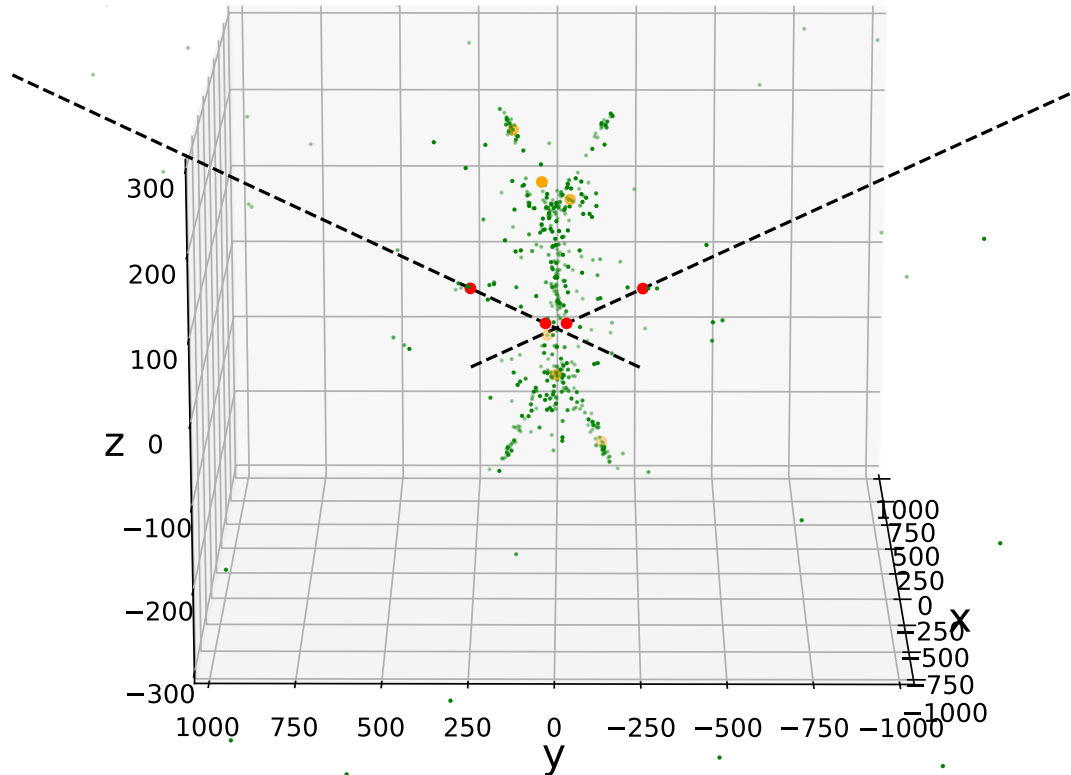
Larger spread and higher residuals due to worse convergence of PSO in larger volume...



- Seismometers need space to predict low frequency Newtonian Noise

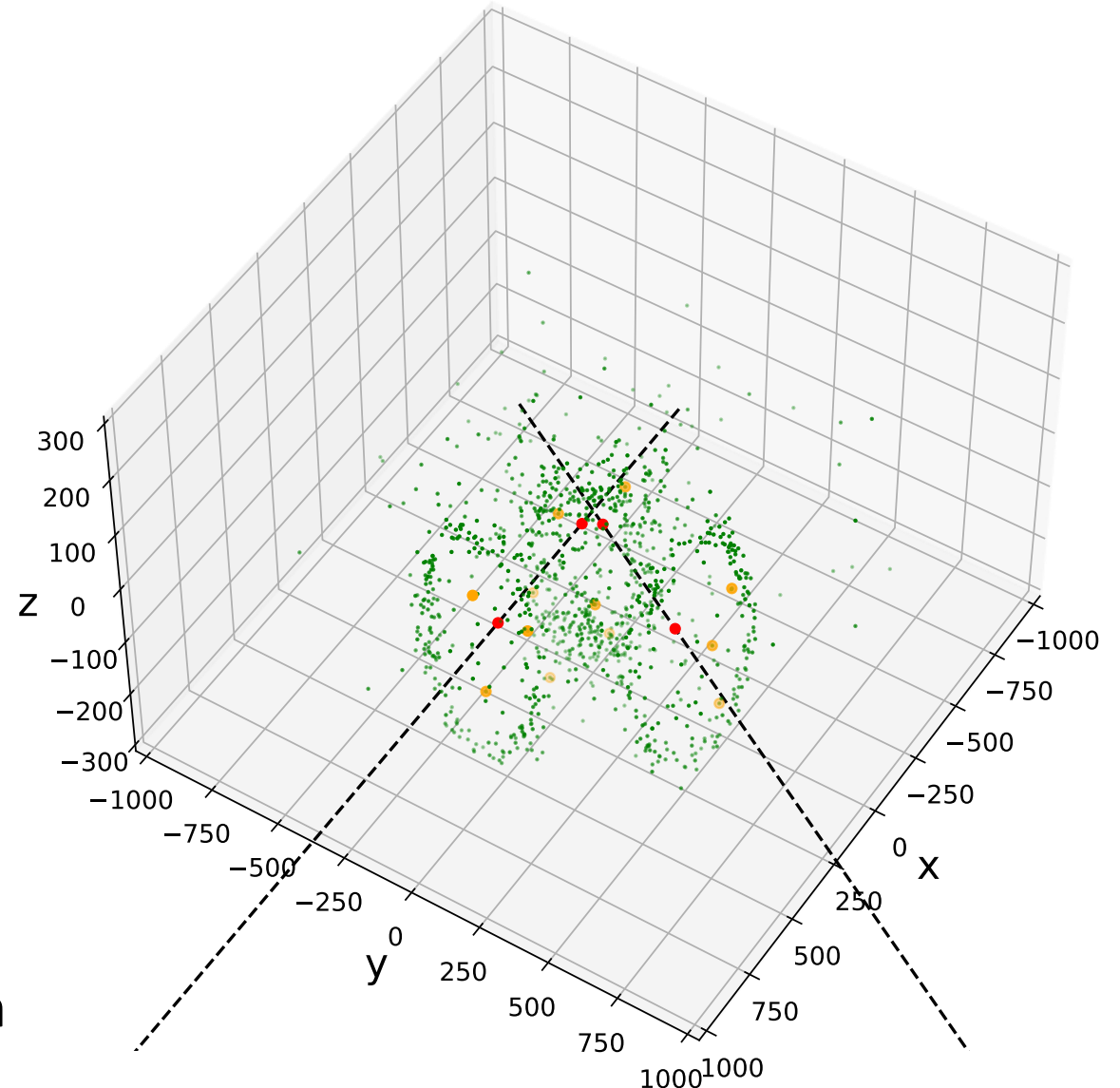
Optimal Positions

Symmetry in Optimization ($N = 6, f = 10, p = 0.2$)

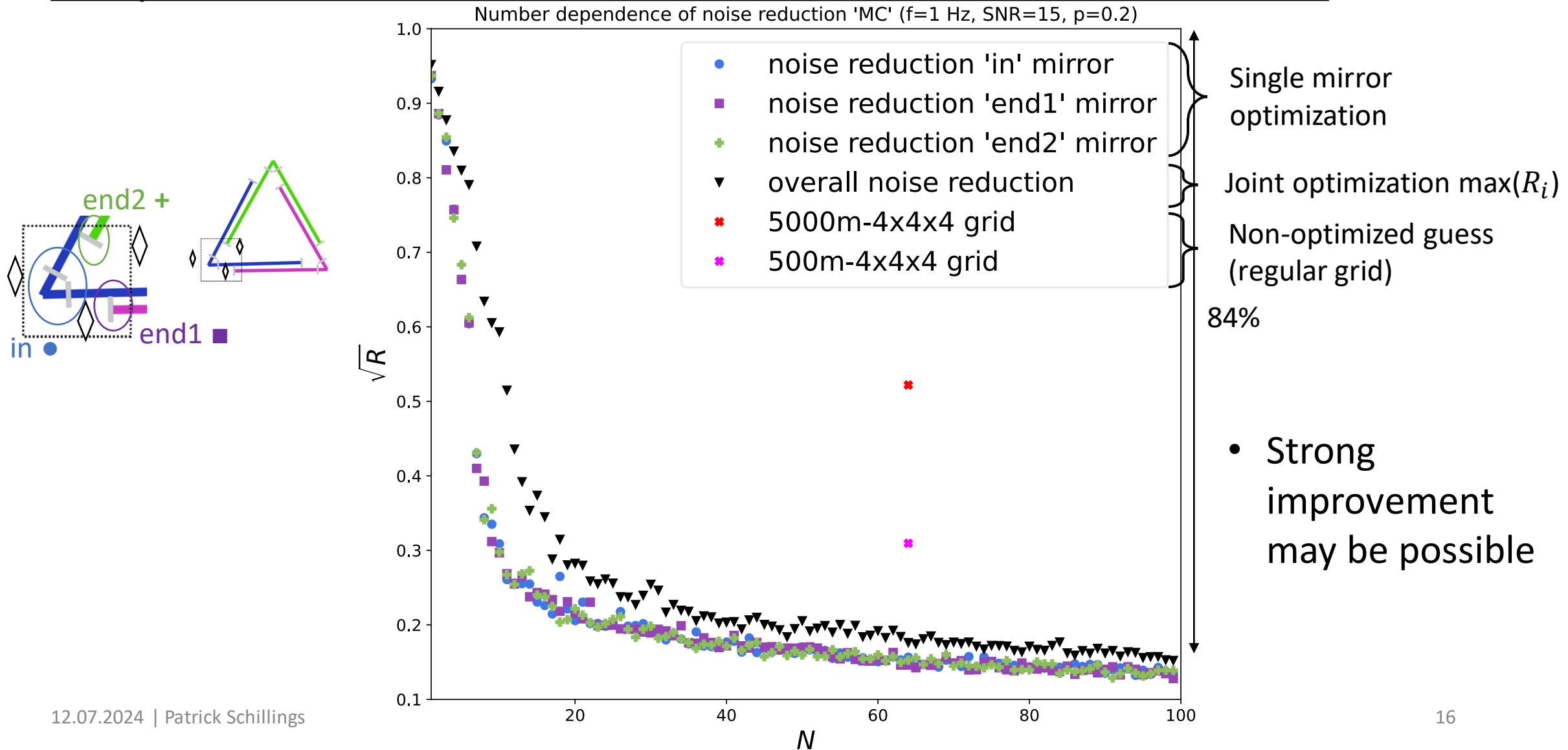


- There is a natural occurring symmetry in the optimized positions

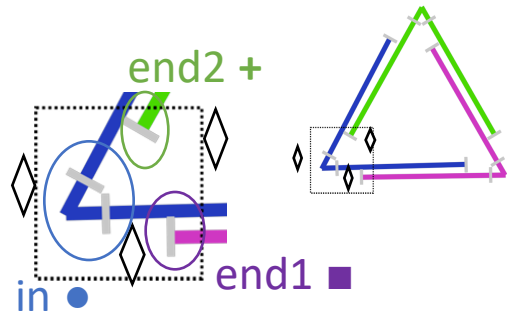
Symmetry in Optimization ($N = 12, f = 10, p = 0.6$)



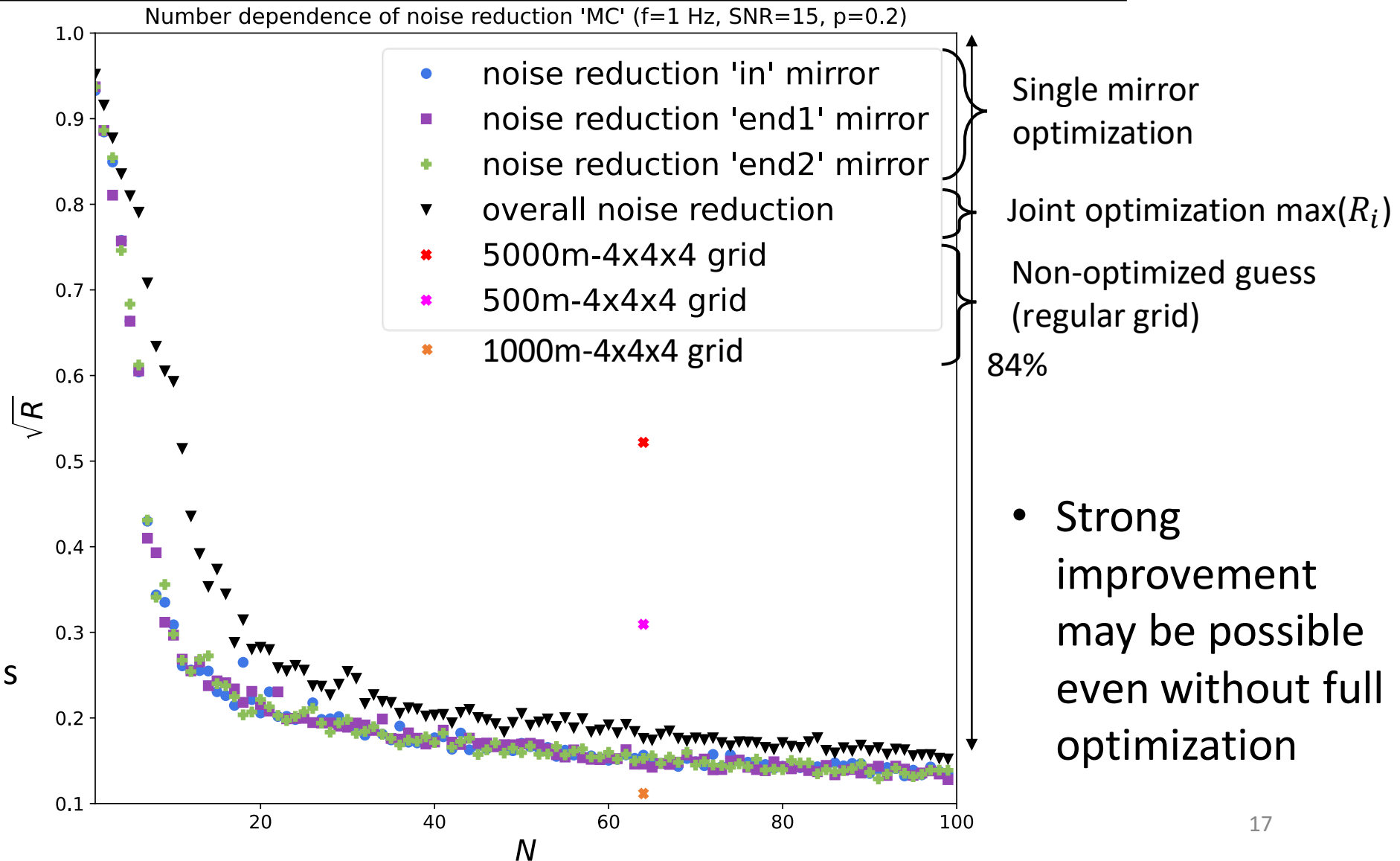
Dependence on Number of Seismometers



Dependence on Number of Seismometers

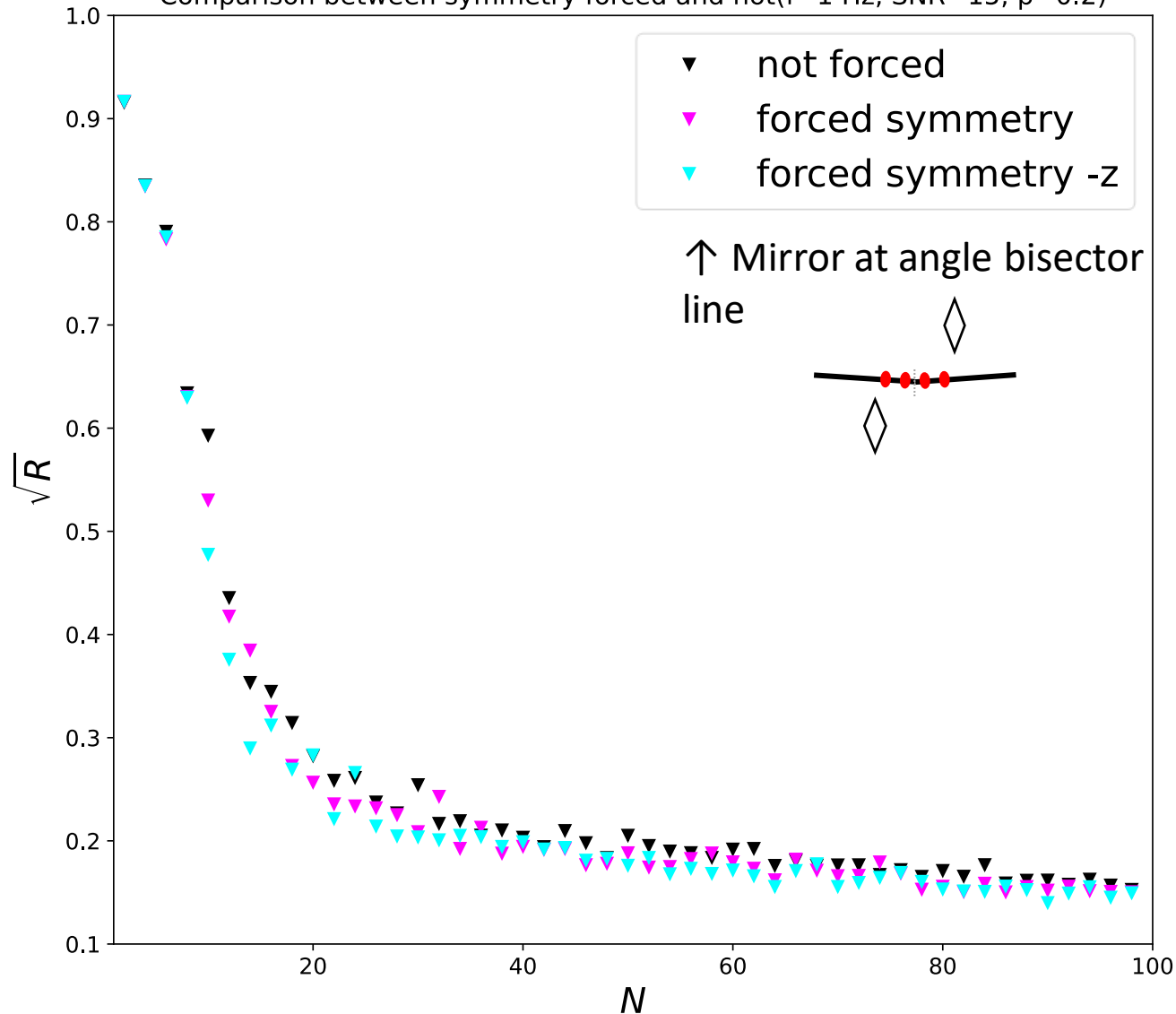


- Limited optimization with PSO for $N > 20$
- In the process of testing alternative optimization algorithms (e.g. LBFGS)



Dependence on Number of Seismometers

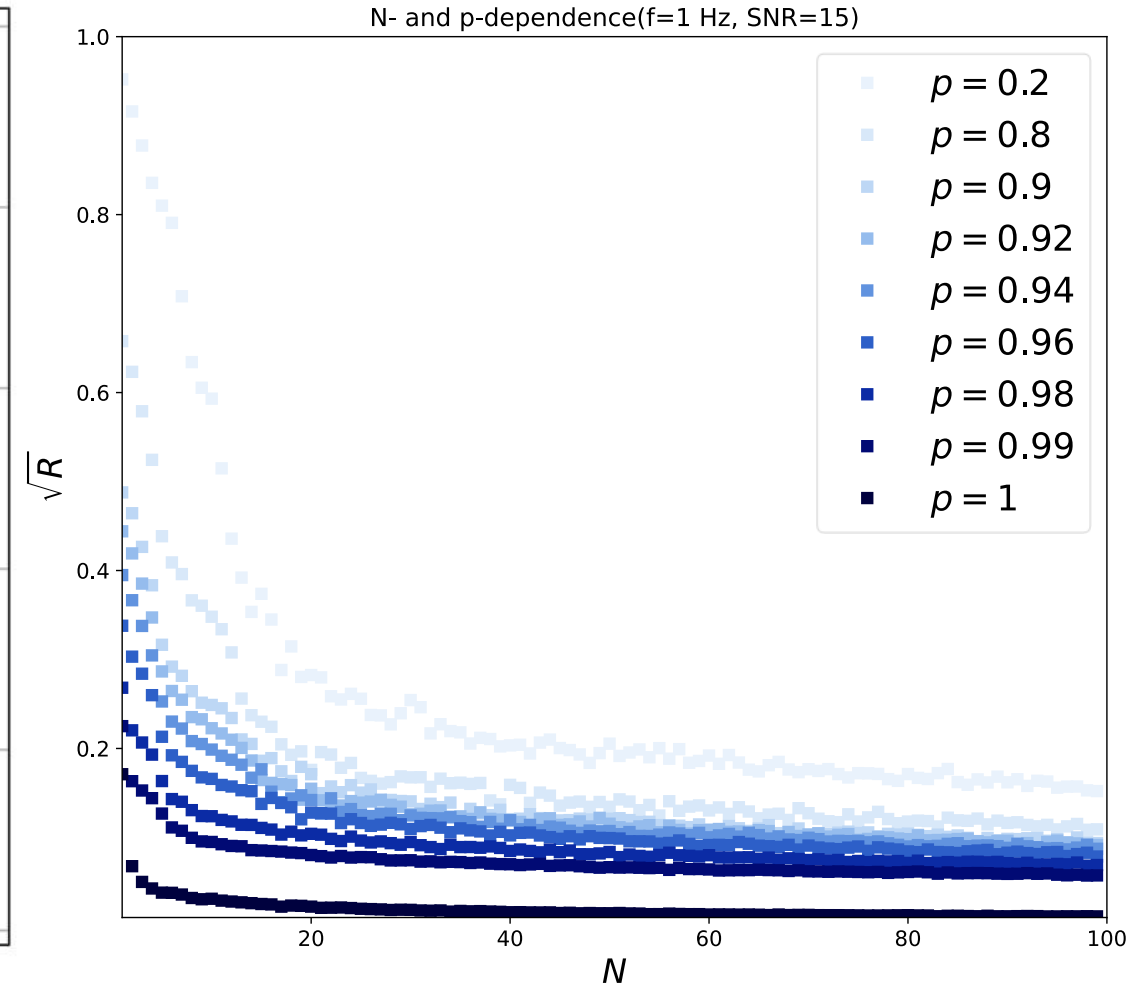
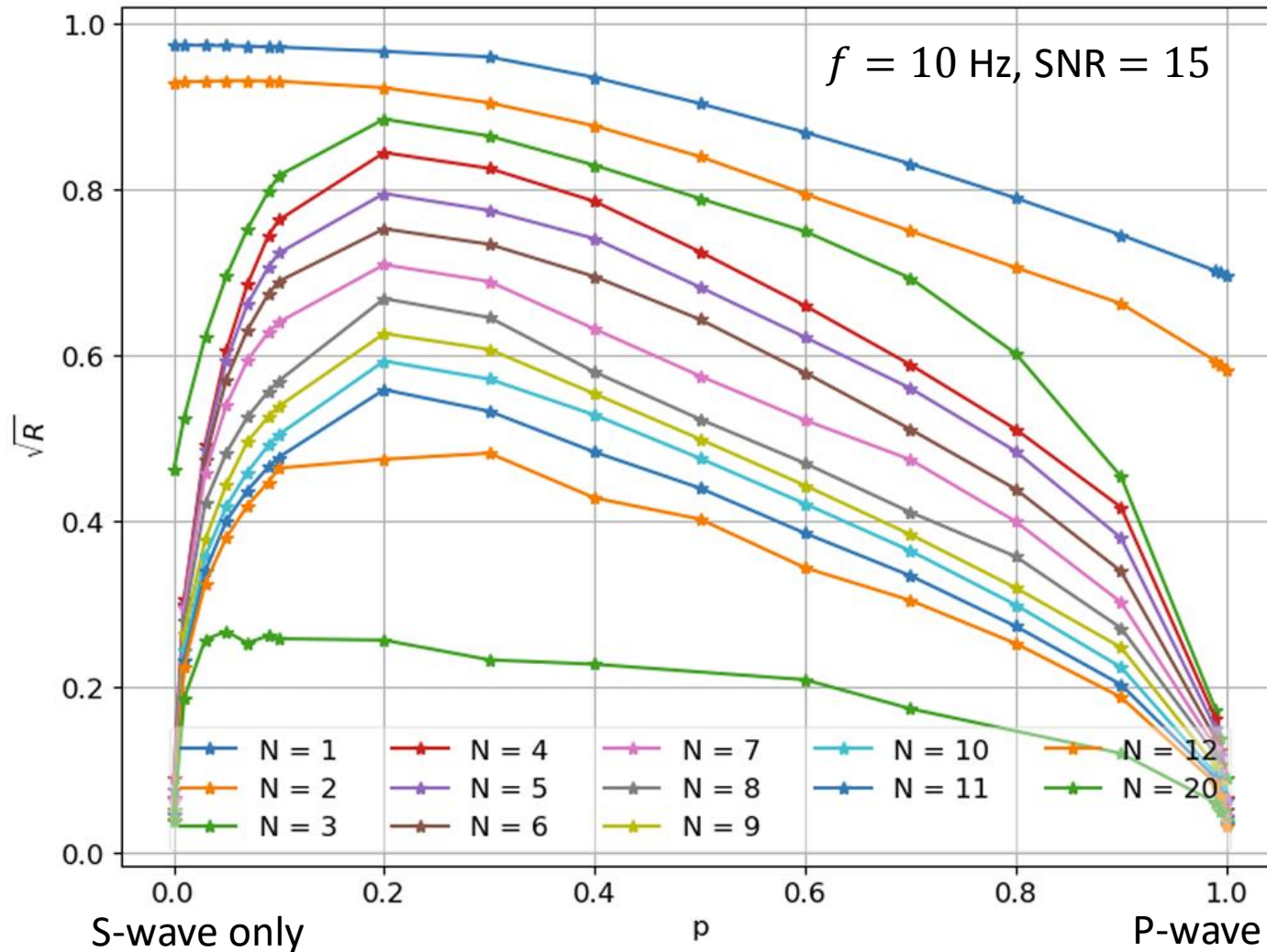
Comparison between symmetry forced and not ($f=1$ Hz, $\text{SNR}=15$, $p=0.2$)



- Exploiting the inherent symmetry can improve the optimization

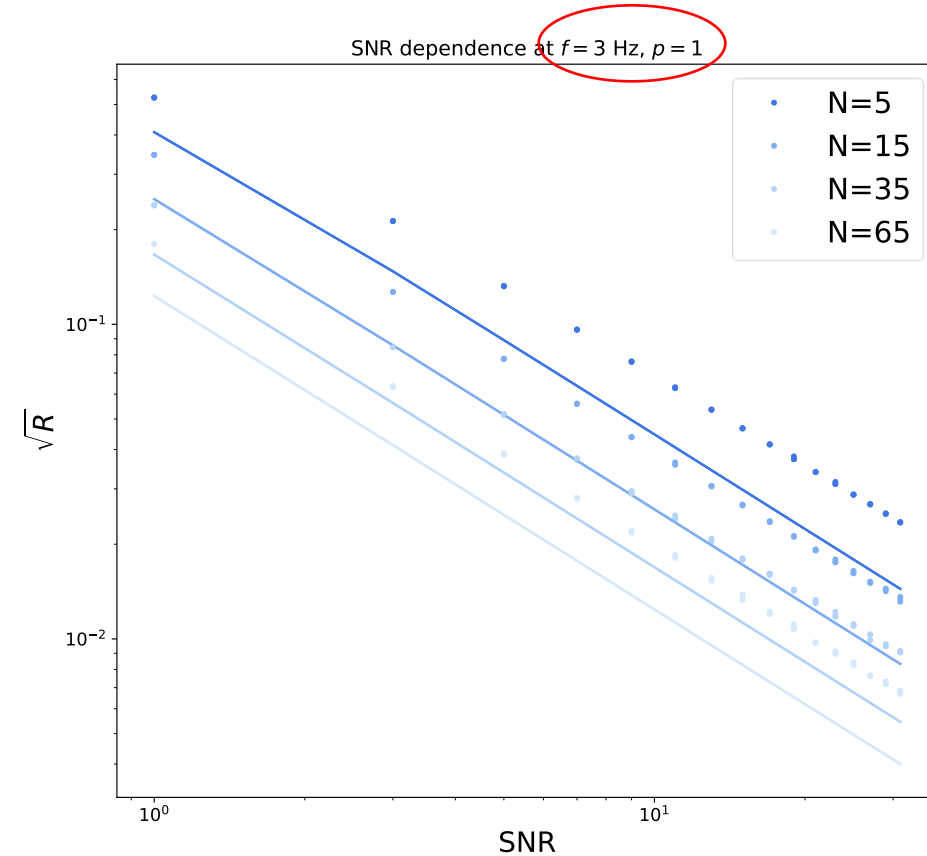
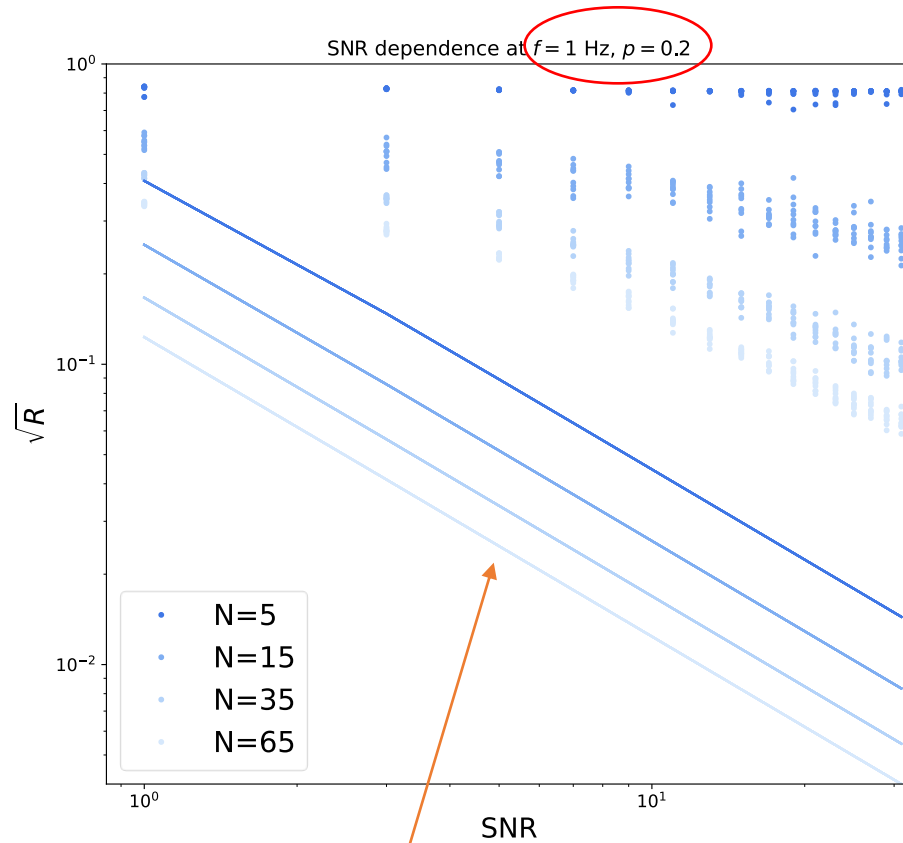
p Dependency

- The first x seismometers optimize the translation gain of certain features (1. Triangulation, 2. P- and S-differentiation, 3. Noise)



SNR Dependency

- R decreases with N and SNR as expected

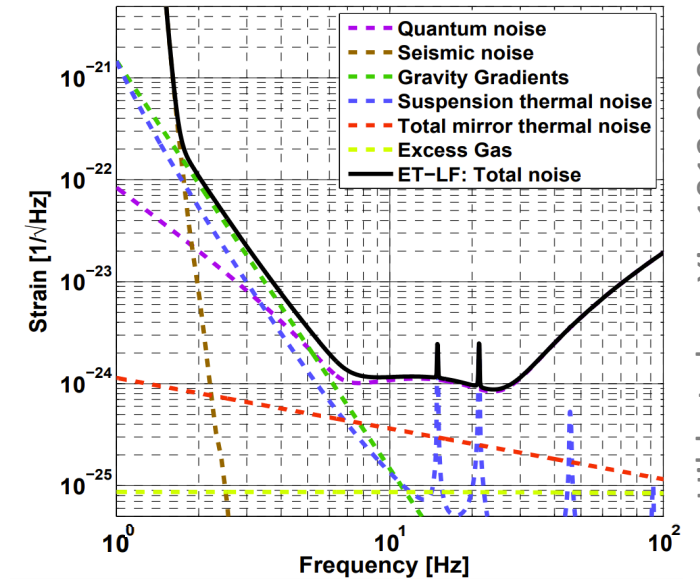
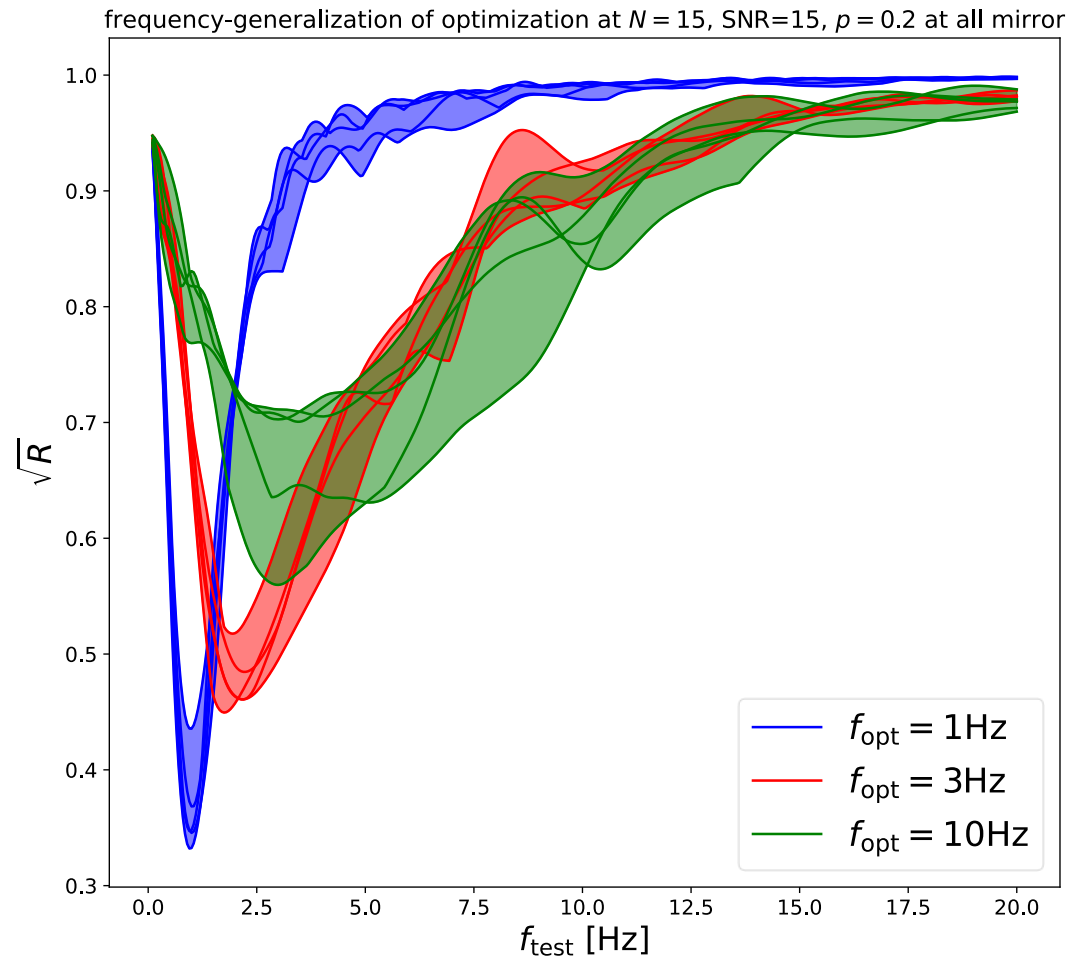


- Well above SNR-limit (mitigation only limited by noise, not translation) when $p \neq 1$ or 0

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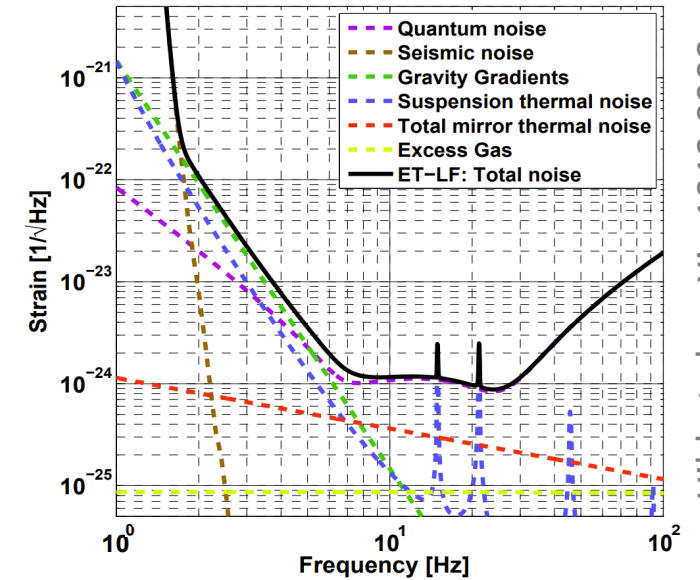
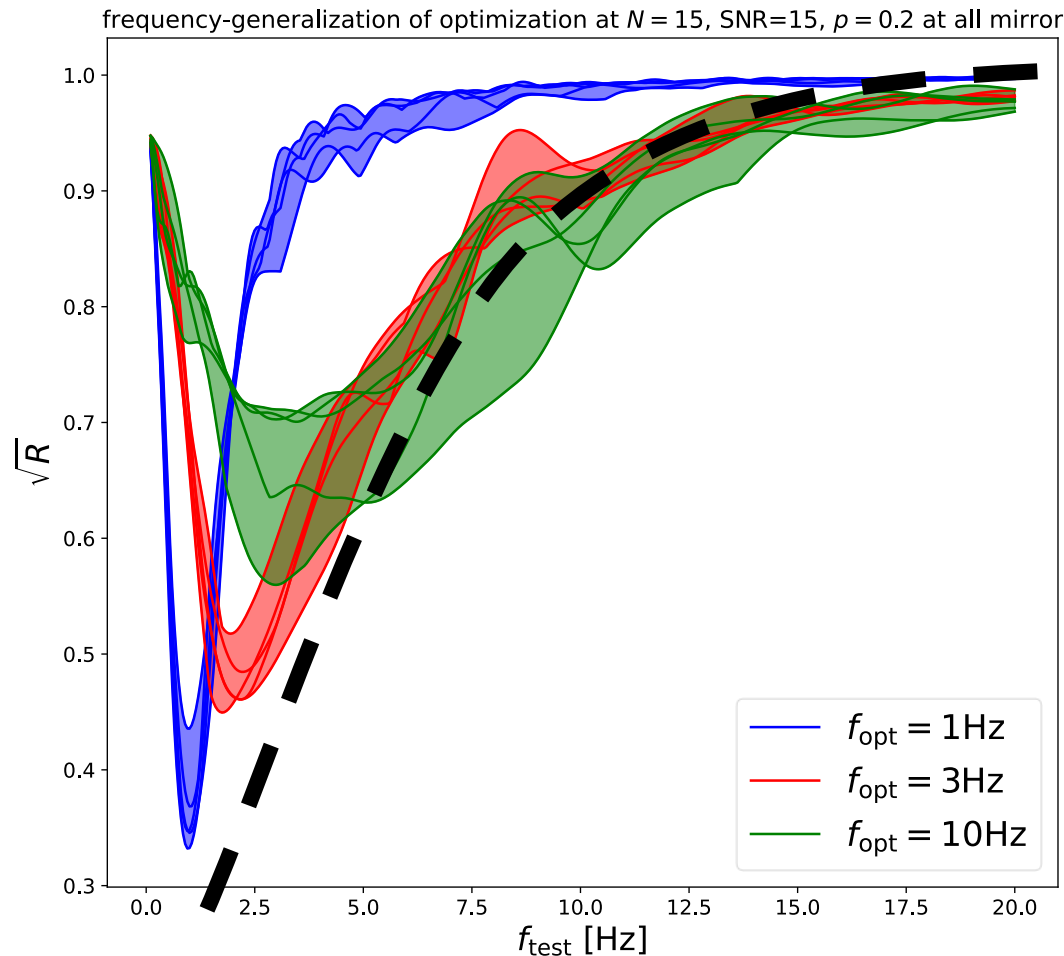
$$R = \frac{1}{1 + N \cdot \text{SNR}^2}$$

Frequency Generalization



- Depends strongly on actual seismometer positions

Frequency Generalization



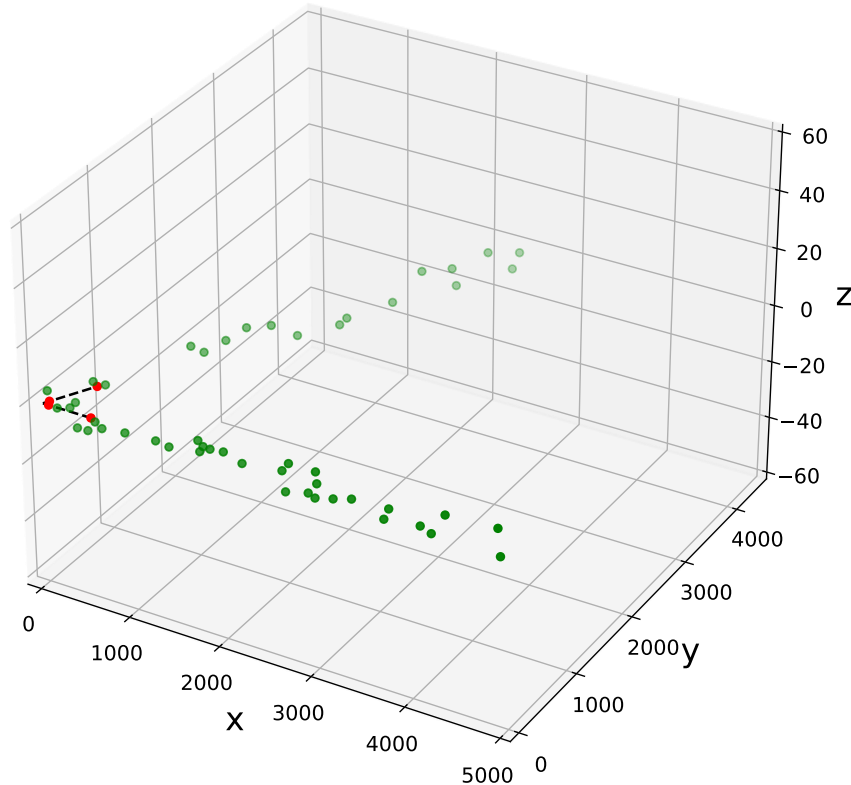
- Depends strongly on actual seismometer positions
- Works differently well for different optimization frequencies

In-Tunnel Optimization

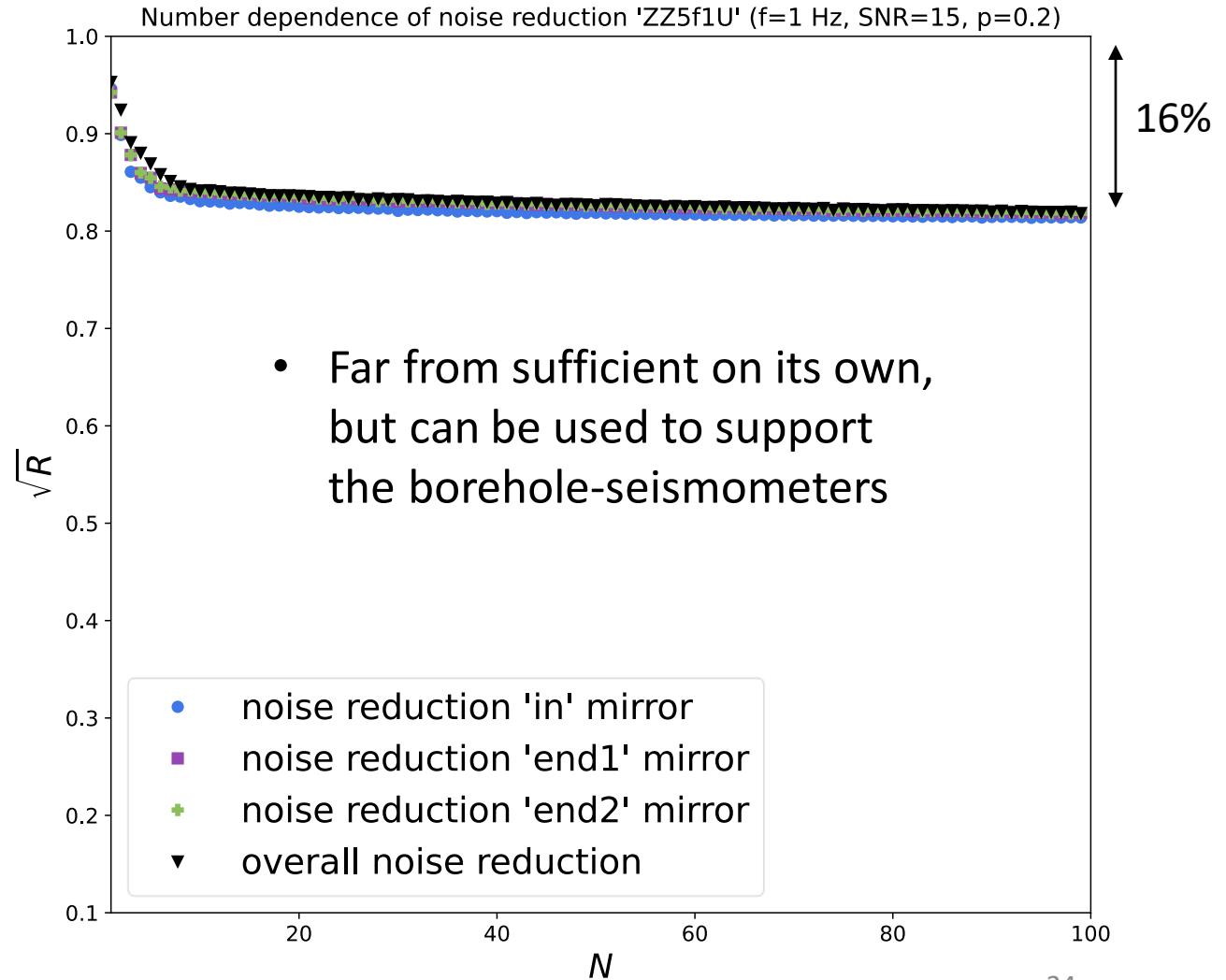
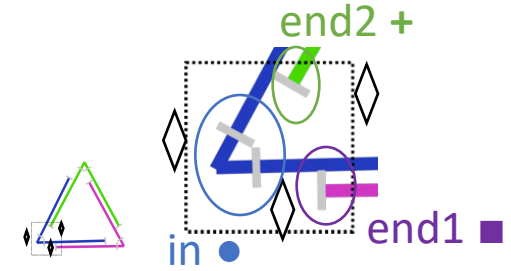
How much improvement can we still achieve if we limit the optimization procedure to the tunnel surface?

Two-Cylinder-Model

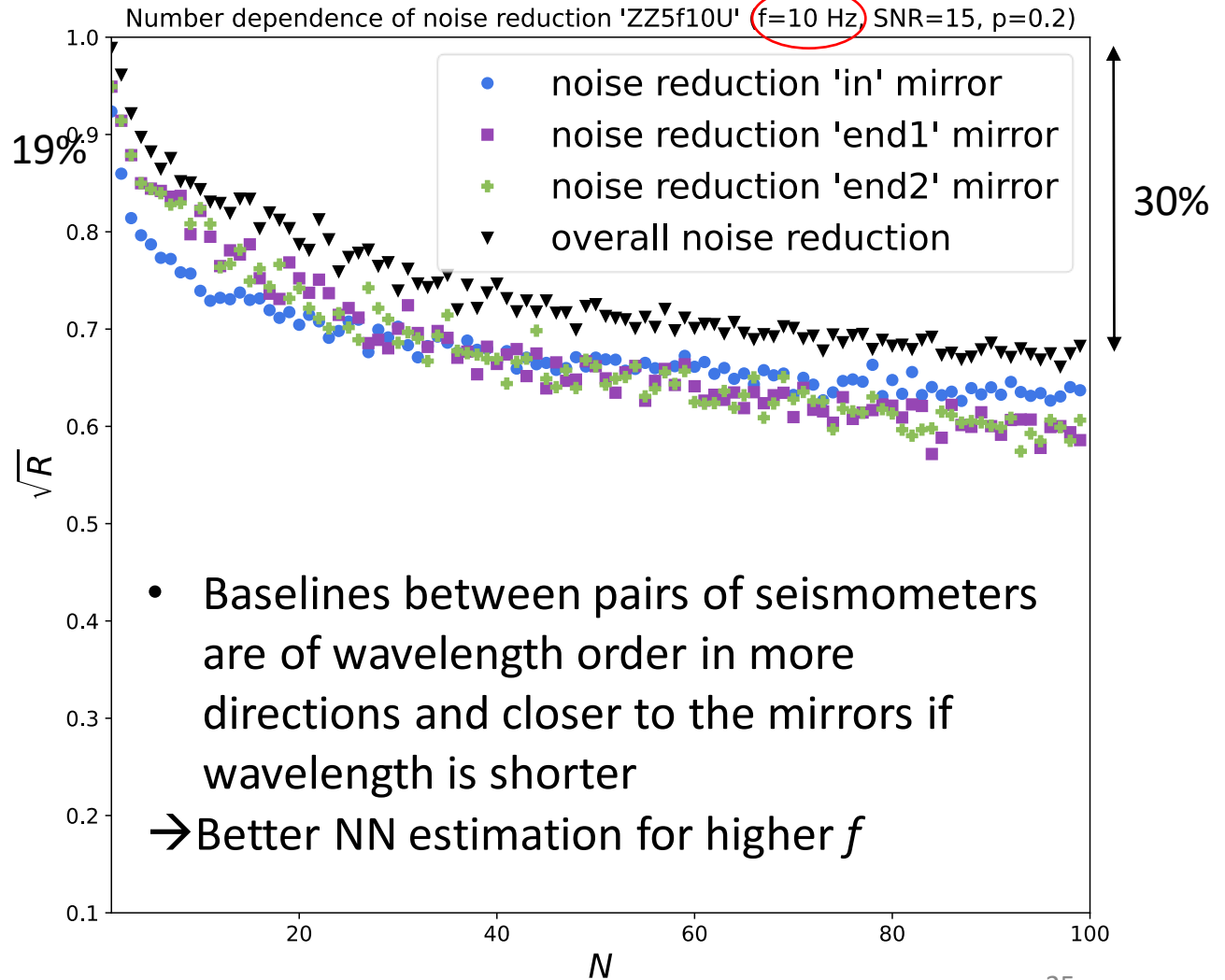
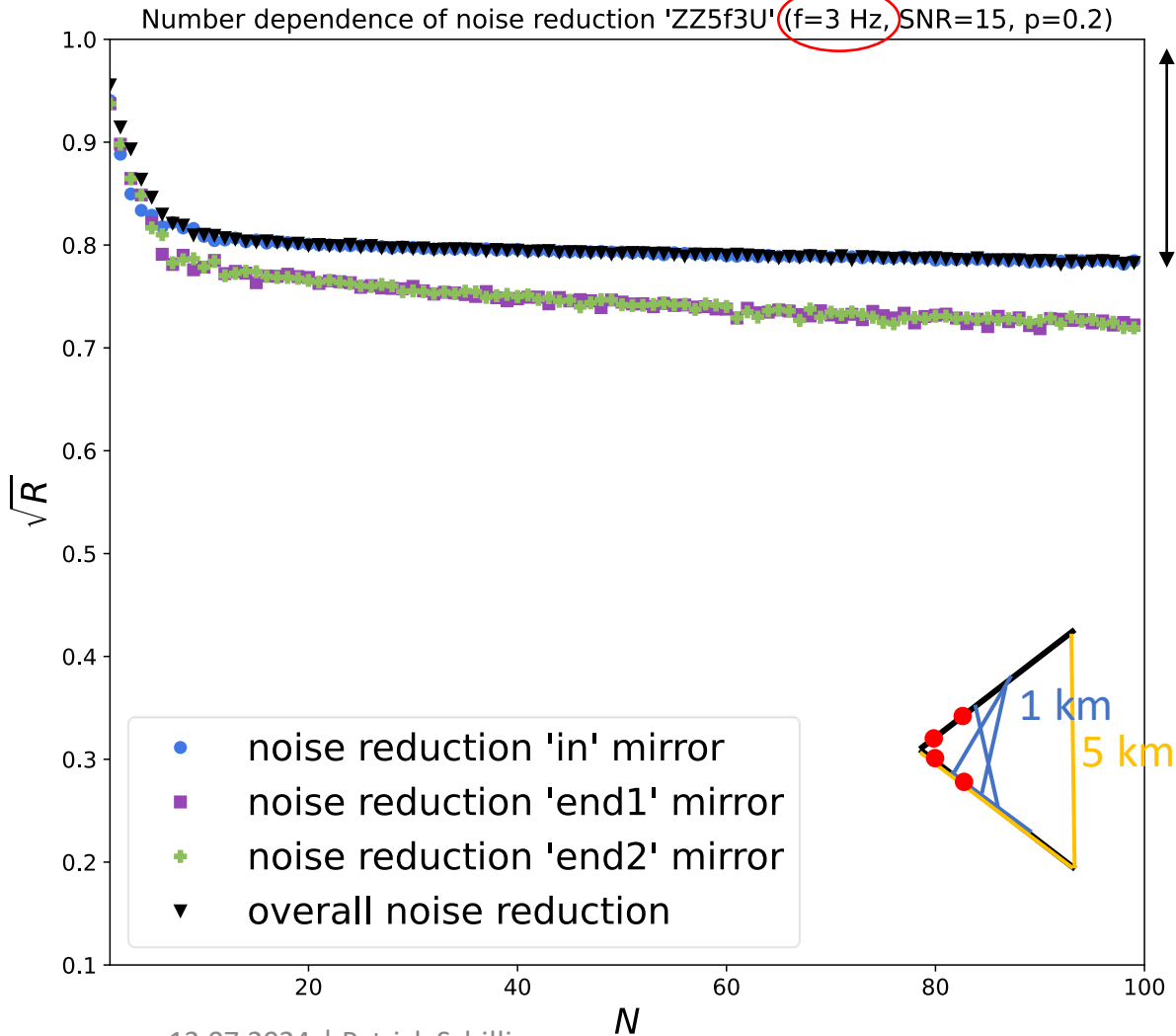
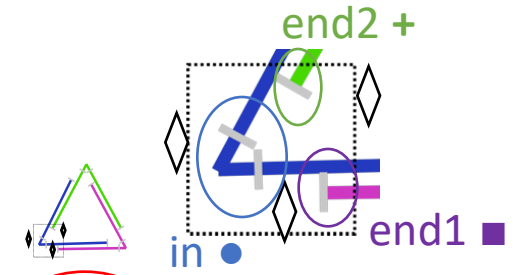
$N=50$



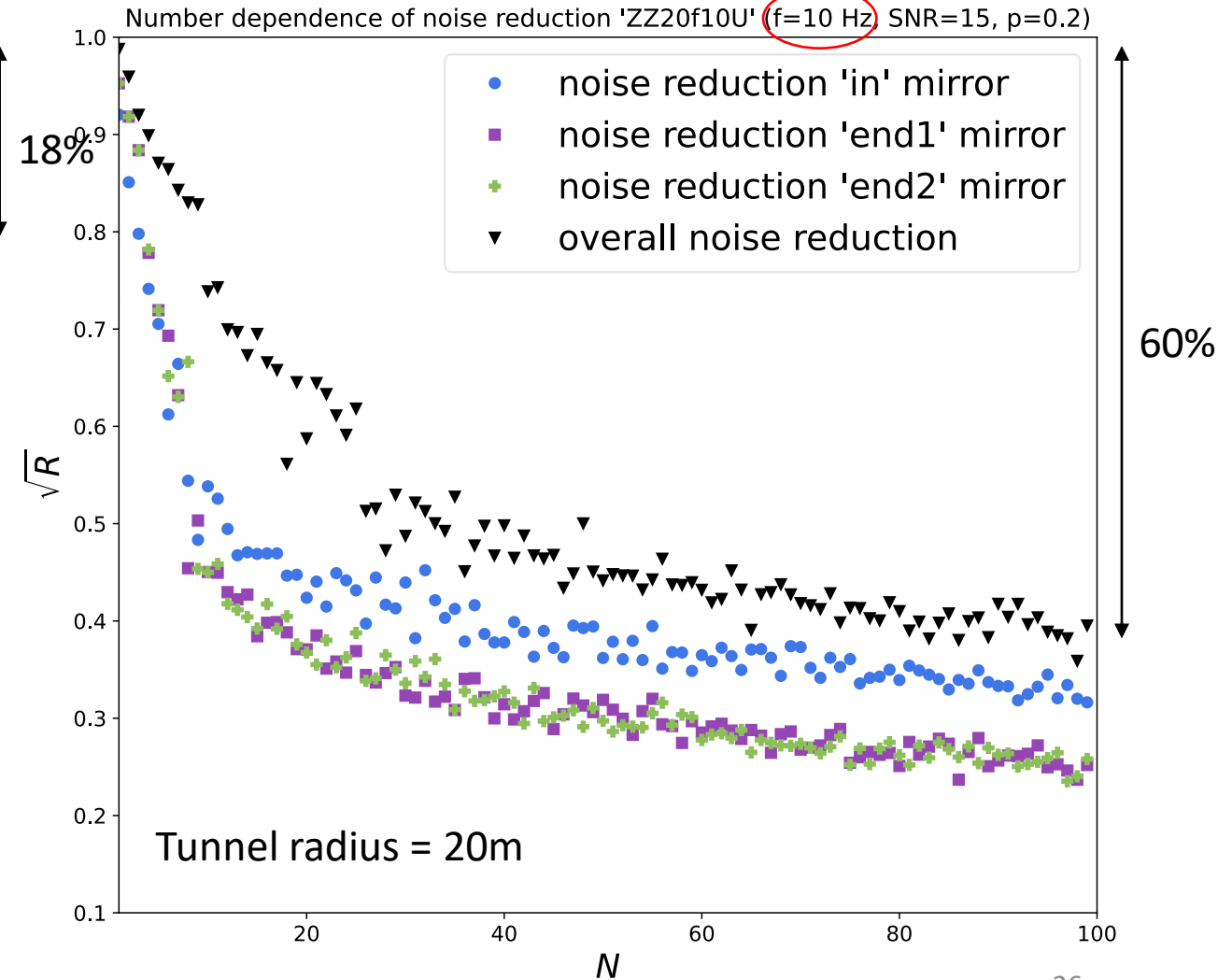
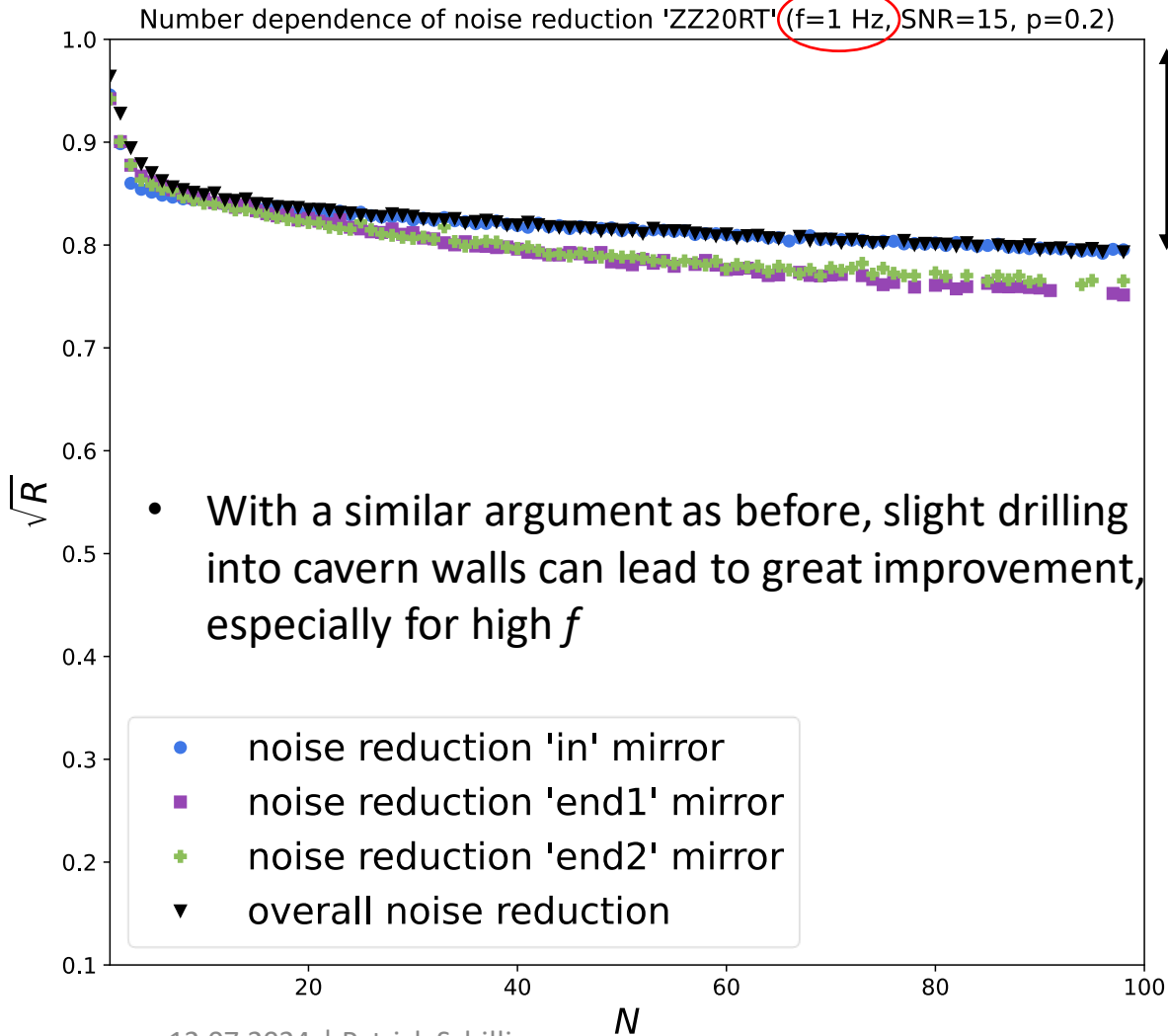
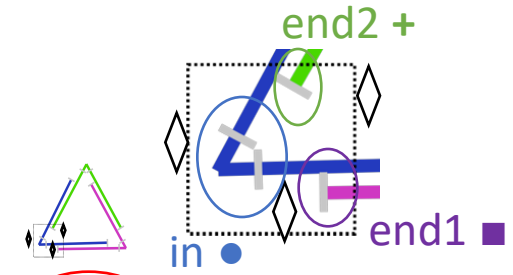
Tunnel radius = 5m



...for Different Frequencies



...for Different Tunnel Radii



-
- Figure 10 consists of two subplots showing the number dependence of noise reduction \sqrt{R} for different noise reduction methods. The x-axis for both plots is the number of modes N , ranging from 0 to 100. The y-axis is \sqrt{R} , ranging from 0.1 to 1.0.
- The left subplot is titled "Number dependence of noise reduction 'MC' (f=1 Hz, SNR=15, p=0.2)". It shows the noise reduction for the 'MC' method. The legend includes:
 - noise reduction 'in' mirror (blue circles)
 - noise reduction 'end1' mirror (purple squares)
 - noise reduction 'end2' mirror (green plus signs)
 - overall noise reduction (black downward triangles)
 - 5000m-4x4x4 grid (red asterisks)
 - 500m-4x4x4 grid (magenta asterisks)
 A vertical orange line is drawn at $N=20$. The noise reduction decreases as N increases, with the overall noise reduction being the highest and the 'in' mirror noise reduction being the lowest.
- The right subplot is titled "Number dependence of noise reduction 'ZZ5f1U' (f=1 Hz, SNR=15, p=0.2)". It shows the noise reduction for the 'ZZ5f1U' method. The legend includes:
 - noise reduction 'in' mirror (blue circles)
 - noise reduction 'end1' mirror (purple squares)
 - noise reduction 'end2' mirror (green plus signs)
 - overall noise reduction (black downward triangles)
 The noise reduction decreases as N increases, with the overall noise reduction being the highest and the 'in' mirror noise reduction being the lowest.

Simulations

Towards a more realistic optimization

Seismic Simulation

- Real-time prediction of Newtonian Noise for wave packages, moving away from the analytic calculation

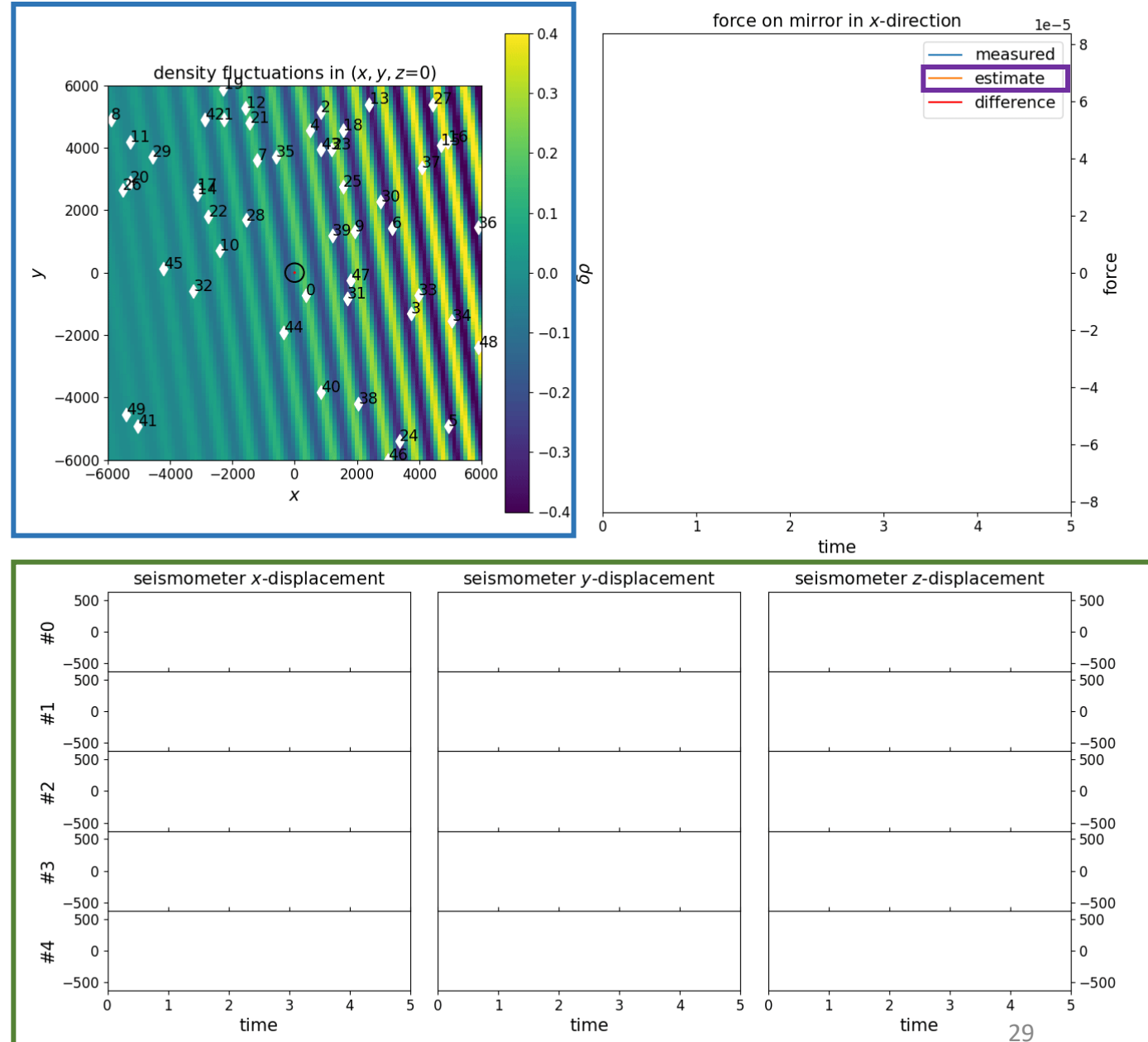
Simulation of density fluctuations generated by p waves from far away, time-limited sources

- ◇ Seismometer projection in $z=0$ -plane
- Cavern
- Force on mirror (x-direction)

Example seismometer data

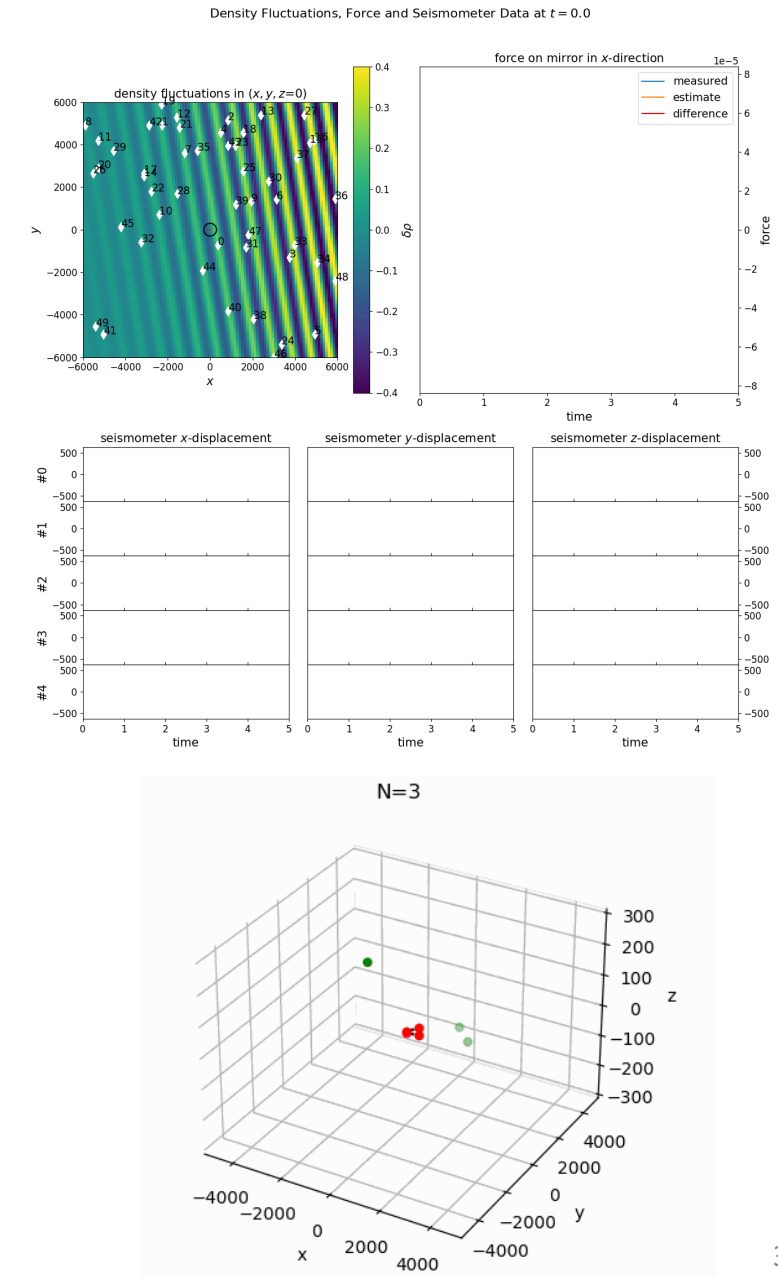
WF*seismometer data (WF from correlations of large number of previous simulations)

Density Fluctuations, Force and Seismometer Data at $t = 0.0$



Summary

- Many results by Francesca, Jan et al. reproduced for < 20 seismometers
- Optimization for > 20 seismometers now possible but probably needs other optimization methods → ongoing work with gradient-based methods
- Performed studies of adding seismometers in tunnels → can reduce number of necessary boreholes
- Working towards a more realistic optimization based on simulations



Backup

Particle Swarm Optimization

For each particle:

$$\vec{v}_{n+1} = \omega \vec{v}_n + c_1 r_1 (\vec{r}_{pb} - \vec{r}_n) + c_2 r_2 (\vec{r}_{gb} - \vec{r}_n)$$

\vec{v}_n - change in particle position in step n

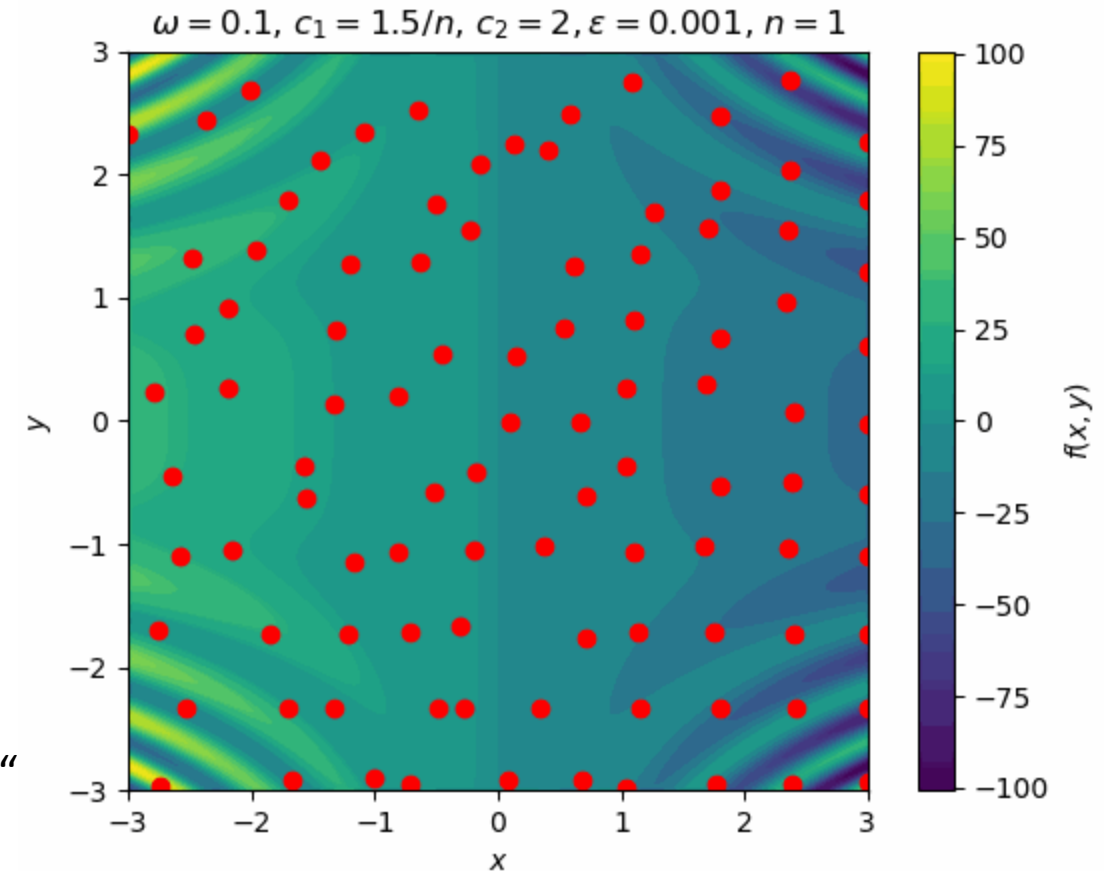
\vec{r}_n - particle position in step n

\vec{r}_{pb} - position of the personal best value, this particle has seen

\vec{r}_{gb} - position of the global best value, one of the particles has seen

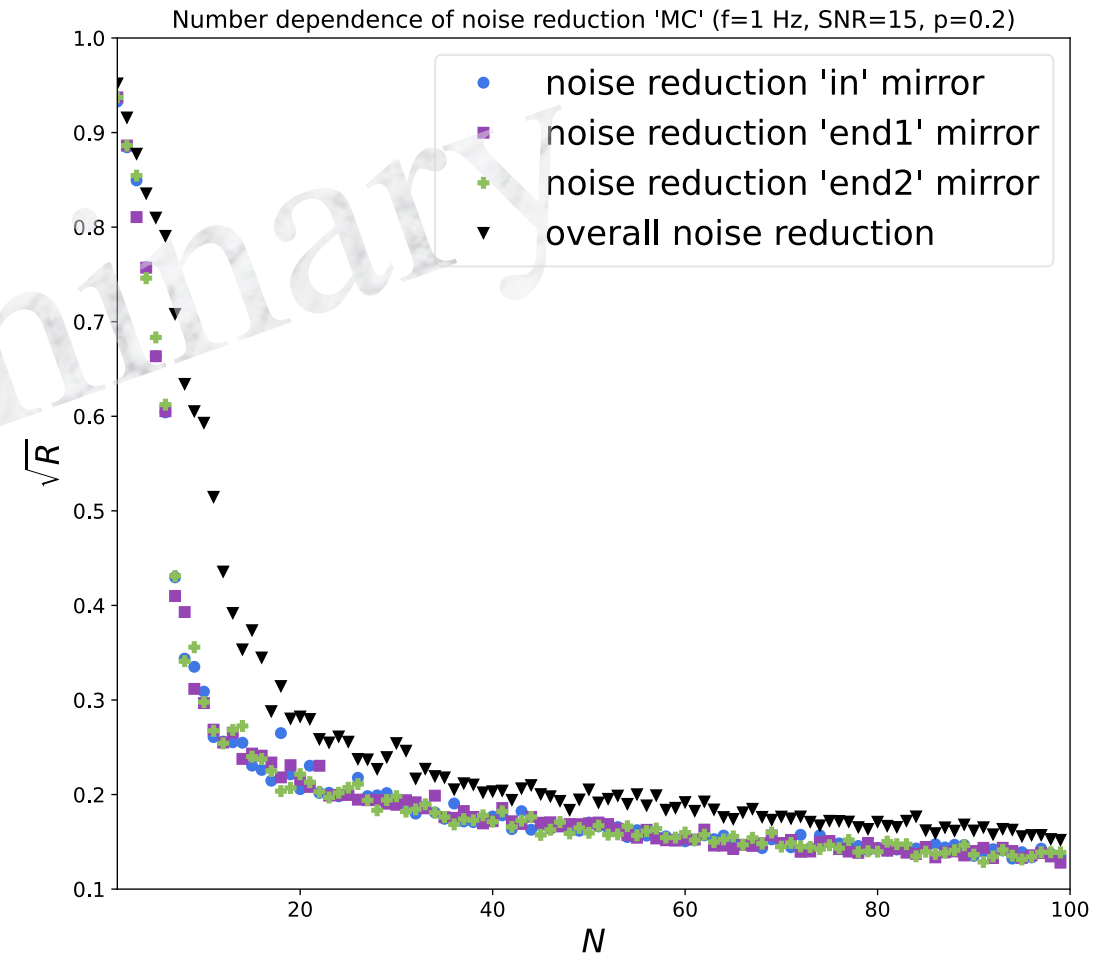
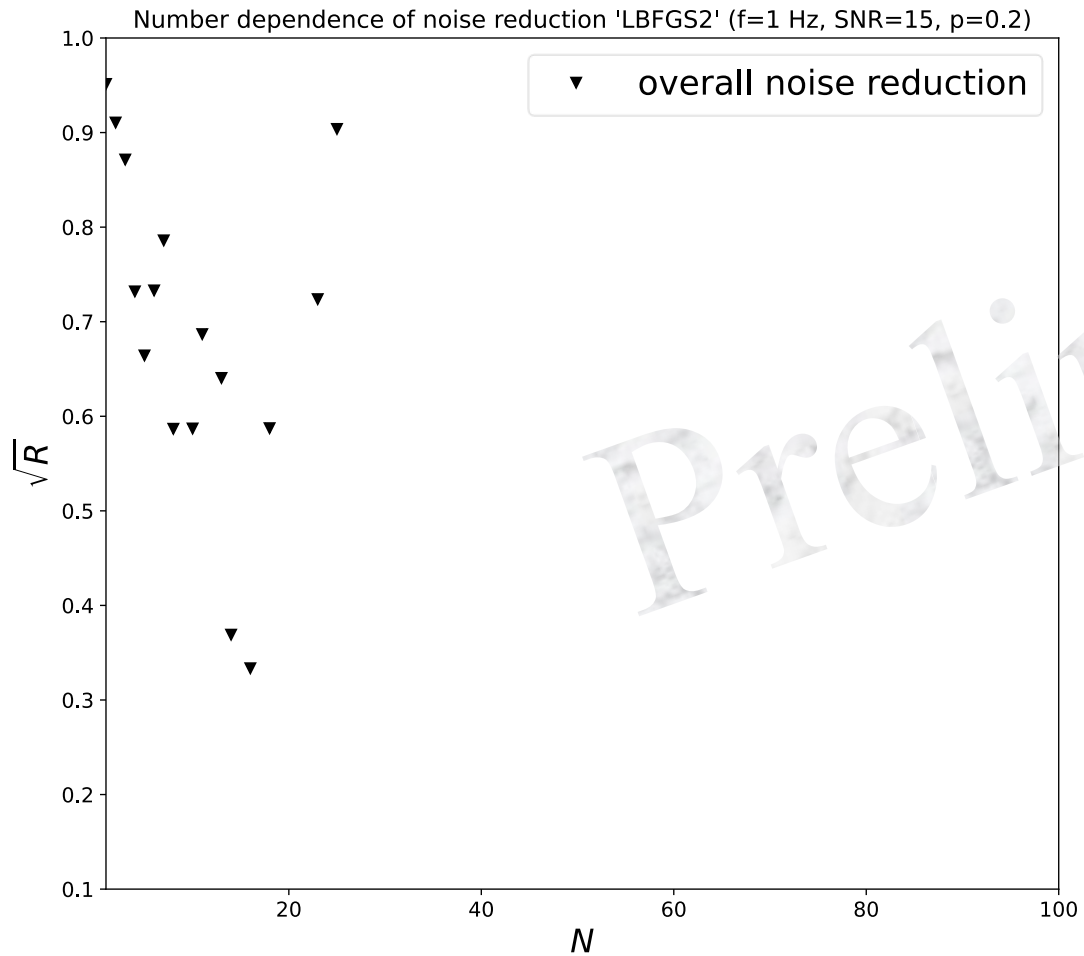
ω, c_1, c_2 - parameters „inertia weight“, „cognitive coefficient“ and „social coefficient“

r_1, r_2 - random numbers $\in [0,1]$



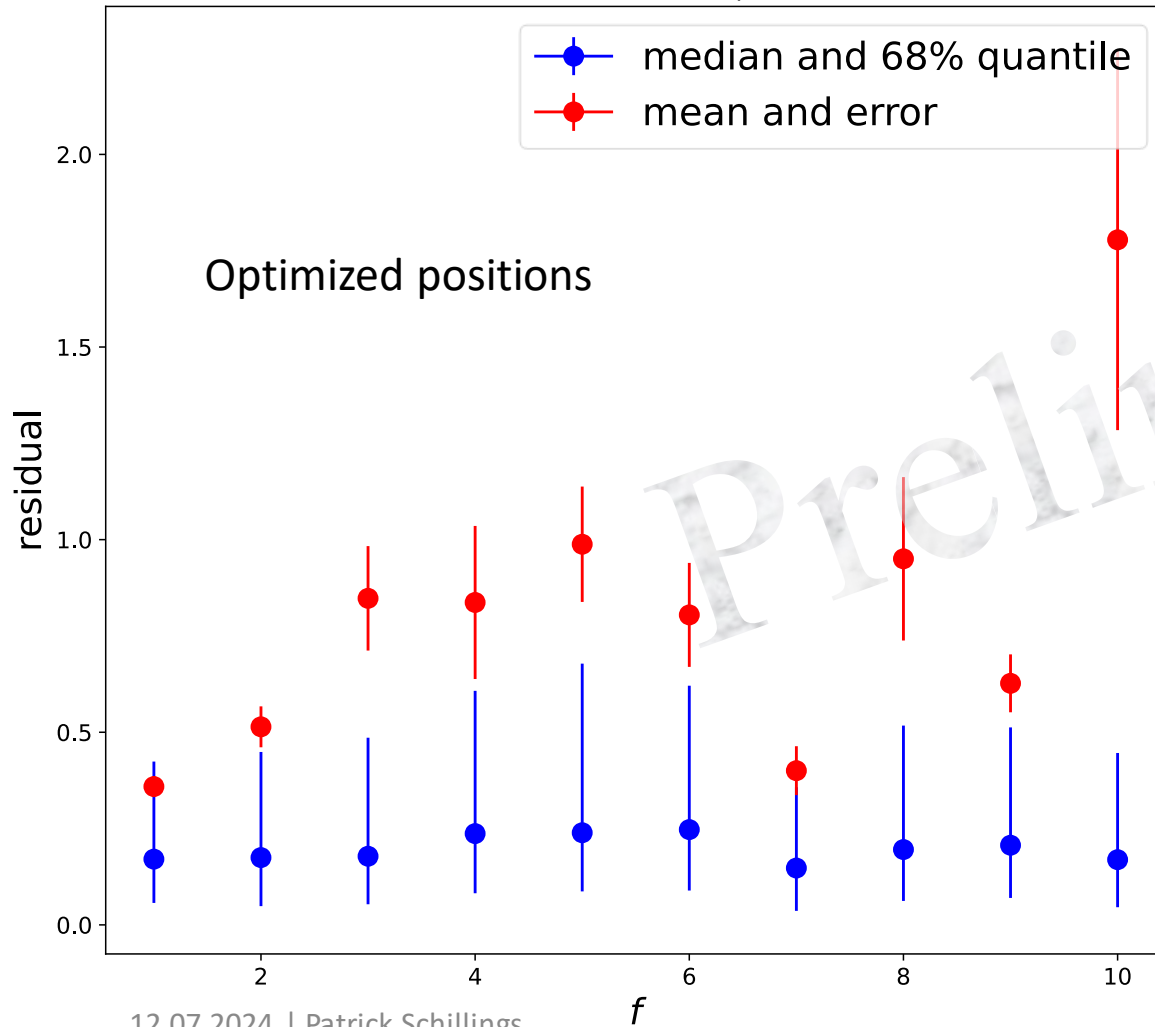
Idea: J. Kennedy & R. Eberhart, *Particle swarm optimization* (1995)

LBFGS-Results

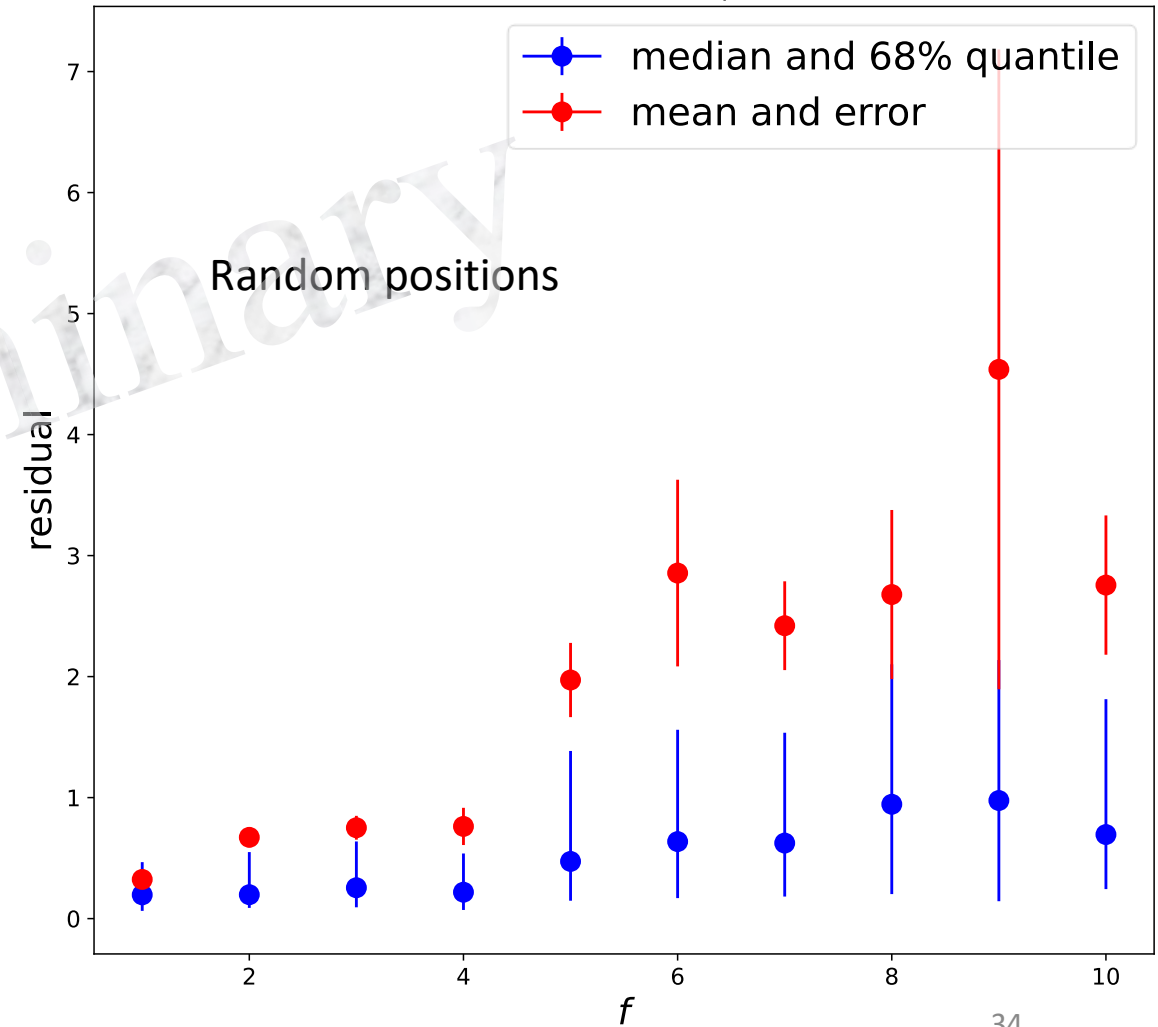


Confidence for Analytical Results

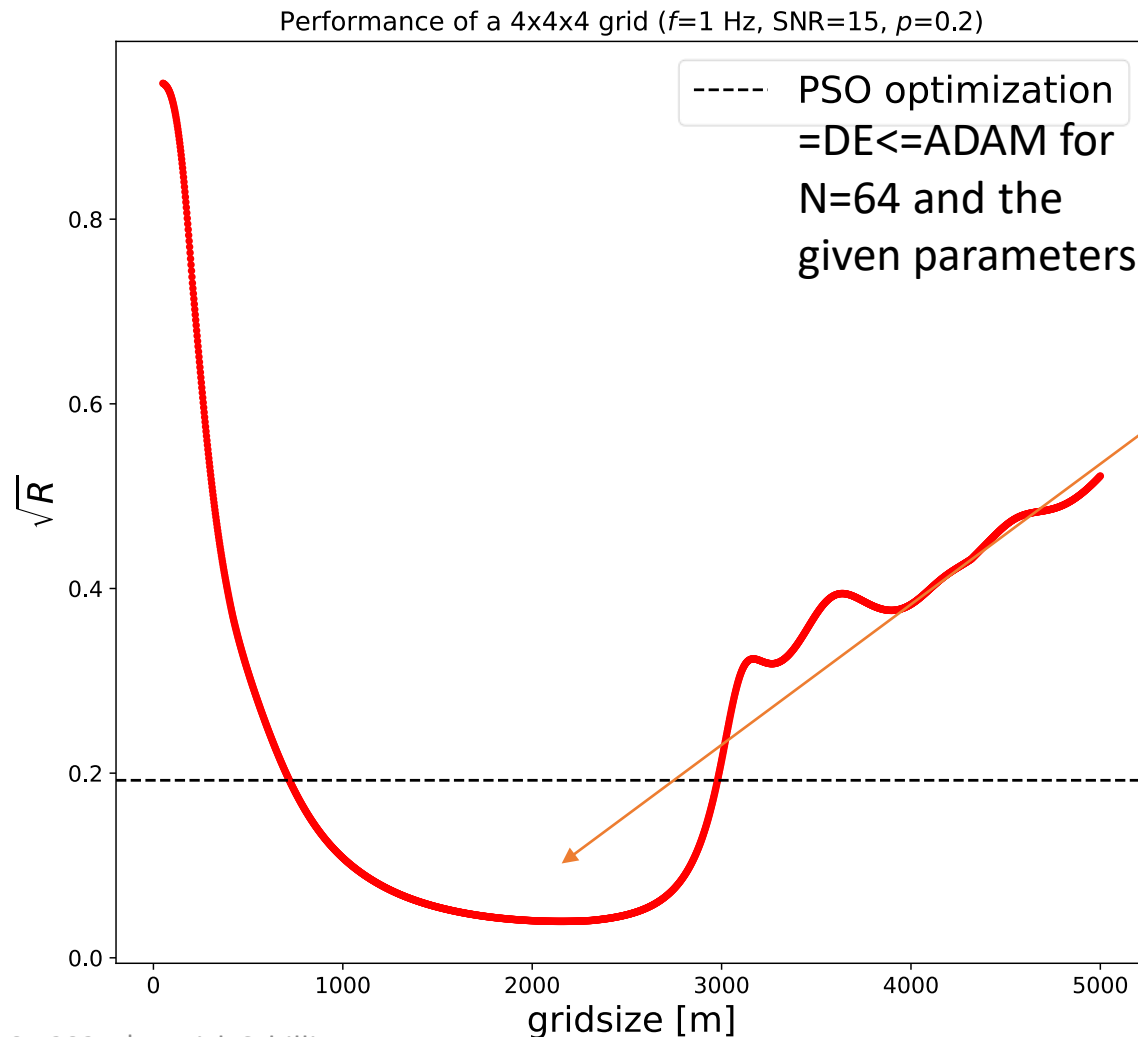
of (N=15, SNR=15, p=1)



rf (N=15, SNR=15, p=1)



Performance of a simple grid



Residual from taking the positions as a 4x4x4 regular cubic grid with a total size of $2 \times \text{gridsize}$ centered at $(0,0,0)$ – the corner of ET

For distances between seismometers close to a quarter of the wavelength, performance is best – even better than all optimization attempts. That's depressing. ☹️

Complicated optimization algorithms may not really find the global minimum. A regular grid isn't even the best one can imagine.

- Is this good news, because in a 1d-minimization it is much, much simpler?
- Is this bad news, because if a grid is not a good choice, will the optimizers be? Can we find good positions in all geometries?
- Is this no big deal, because we do not need the global minimum, but are happy with a local one?