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# Robust multi-frequency sparse Bayesian learning: data results

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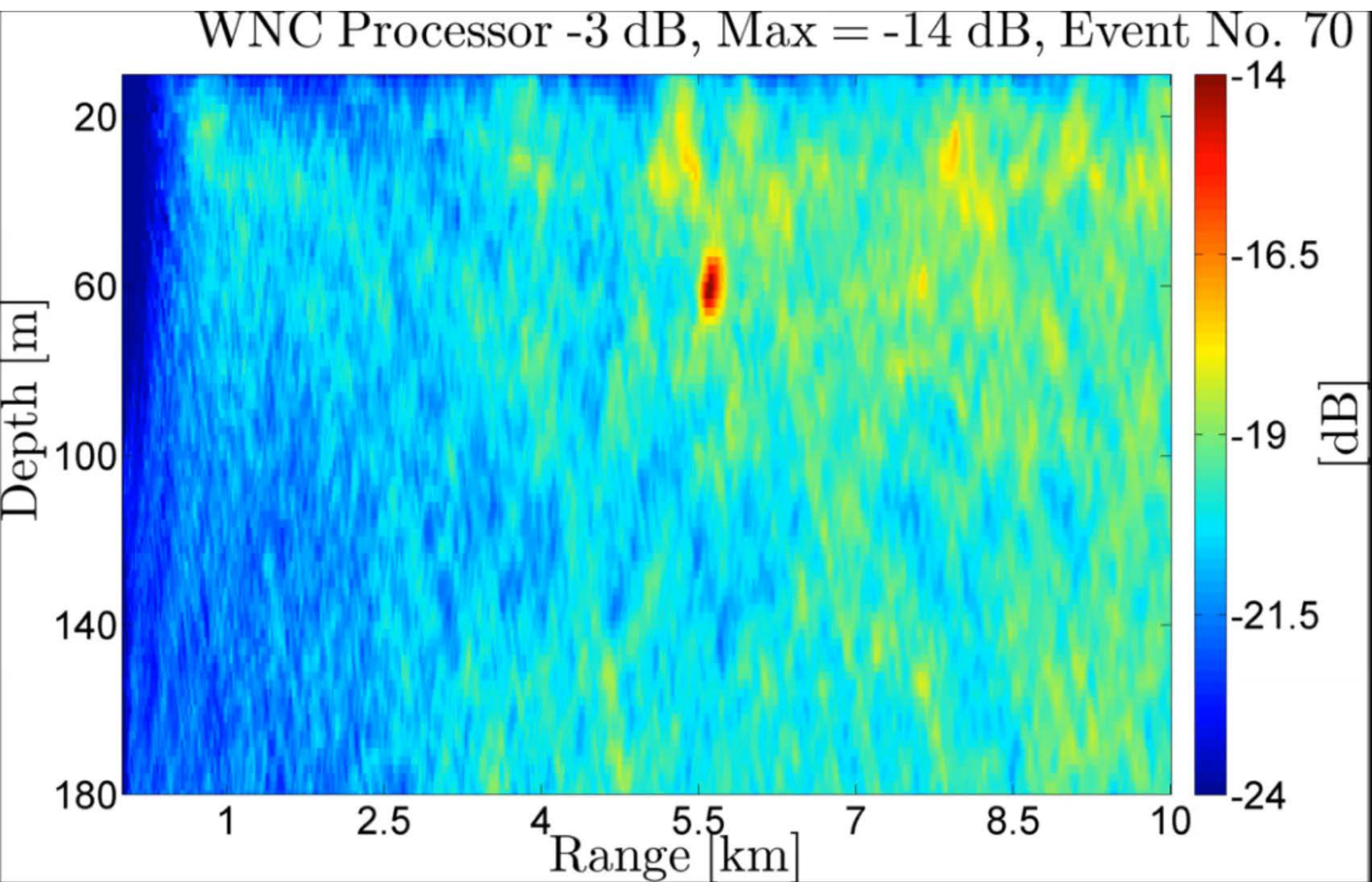
# Presentation objectives

We investigate SBL performance for MFP and CBF and demonstrate using data:

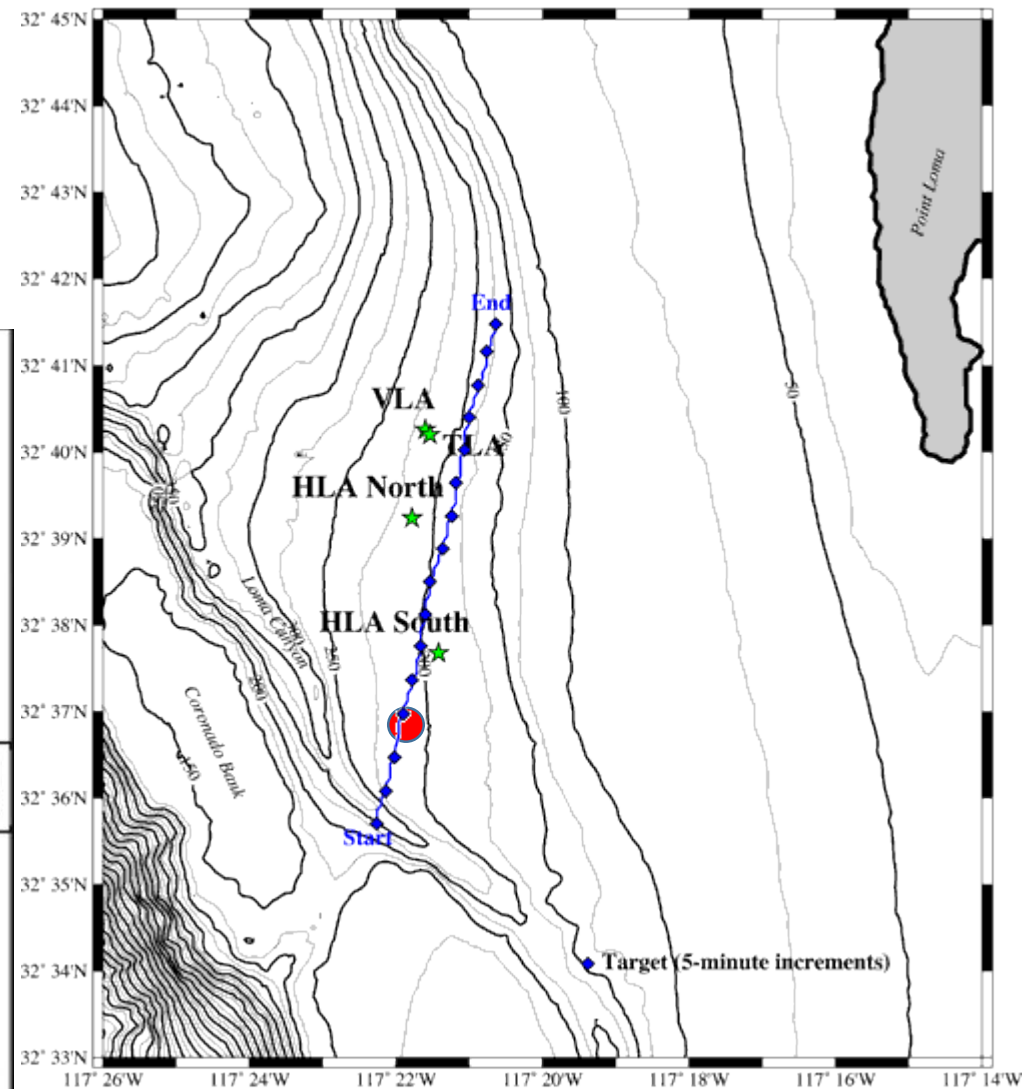
1. SBL behaves similarly to an adaptive processor. The output of SBL is compared to the white noise constraint (WNC), MVDR, and MUSIC processor in a two-source MFP scenario. SBL performs similar to MUSIC and is robust to a “degree” of array-tilt mismatch.
  2. SBL can be used to help identify ray-arrivals for CBF.
- Results are demonstrated with simulated and the SwellEx-96 & Noise-09 data.



# SWellEx-96 – Event S5 – Deep Source

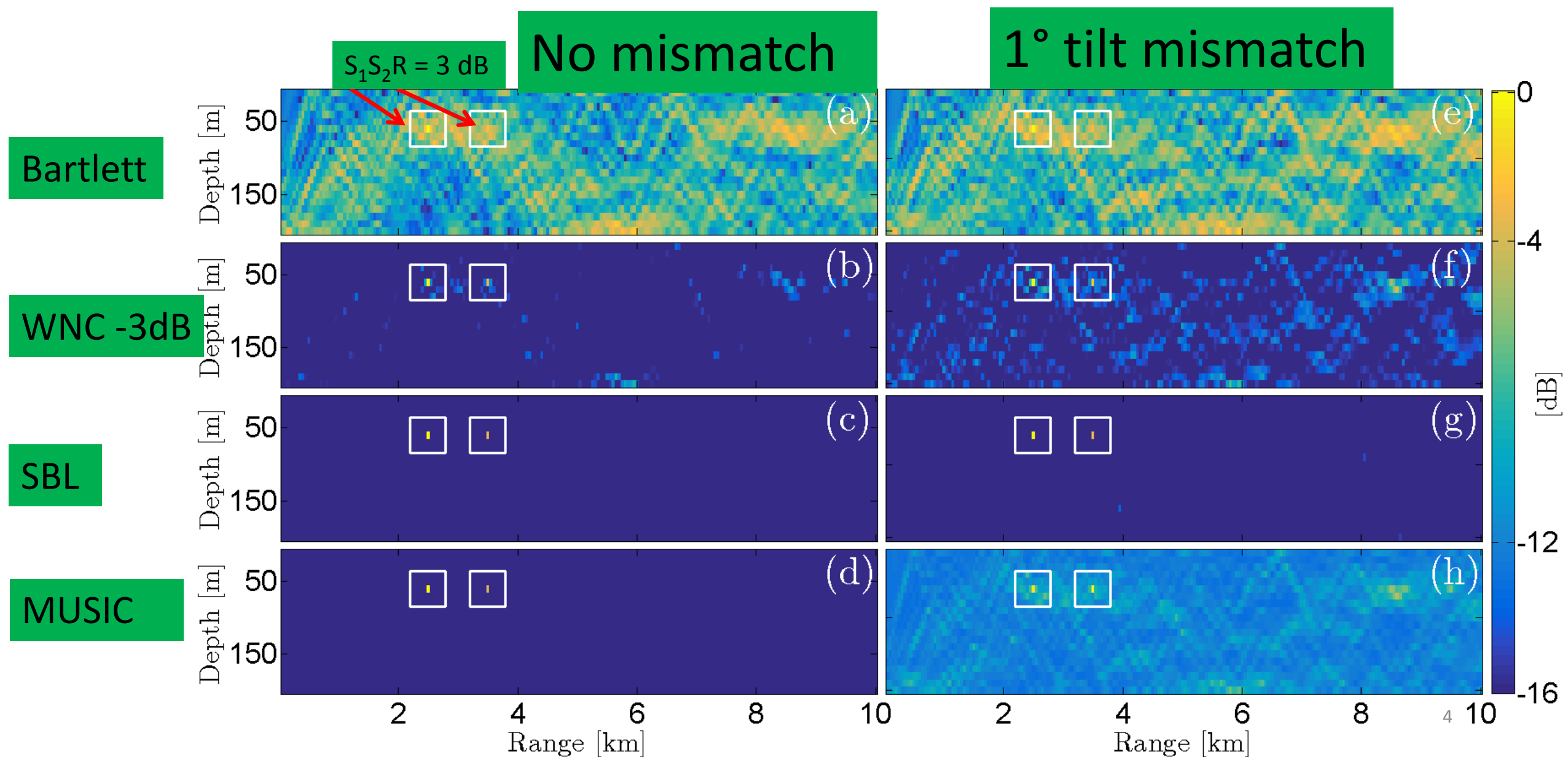


SWellEx-96 Event S5  
JD 131, 23:15 GMT to JD 132, 00:30 GMT



Experiment site (near San Diego) with source track

# SNR Localization Curves – Simulation Intro



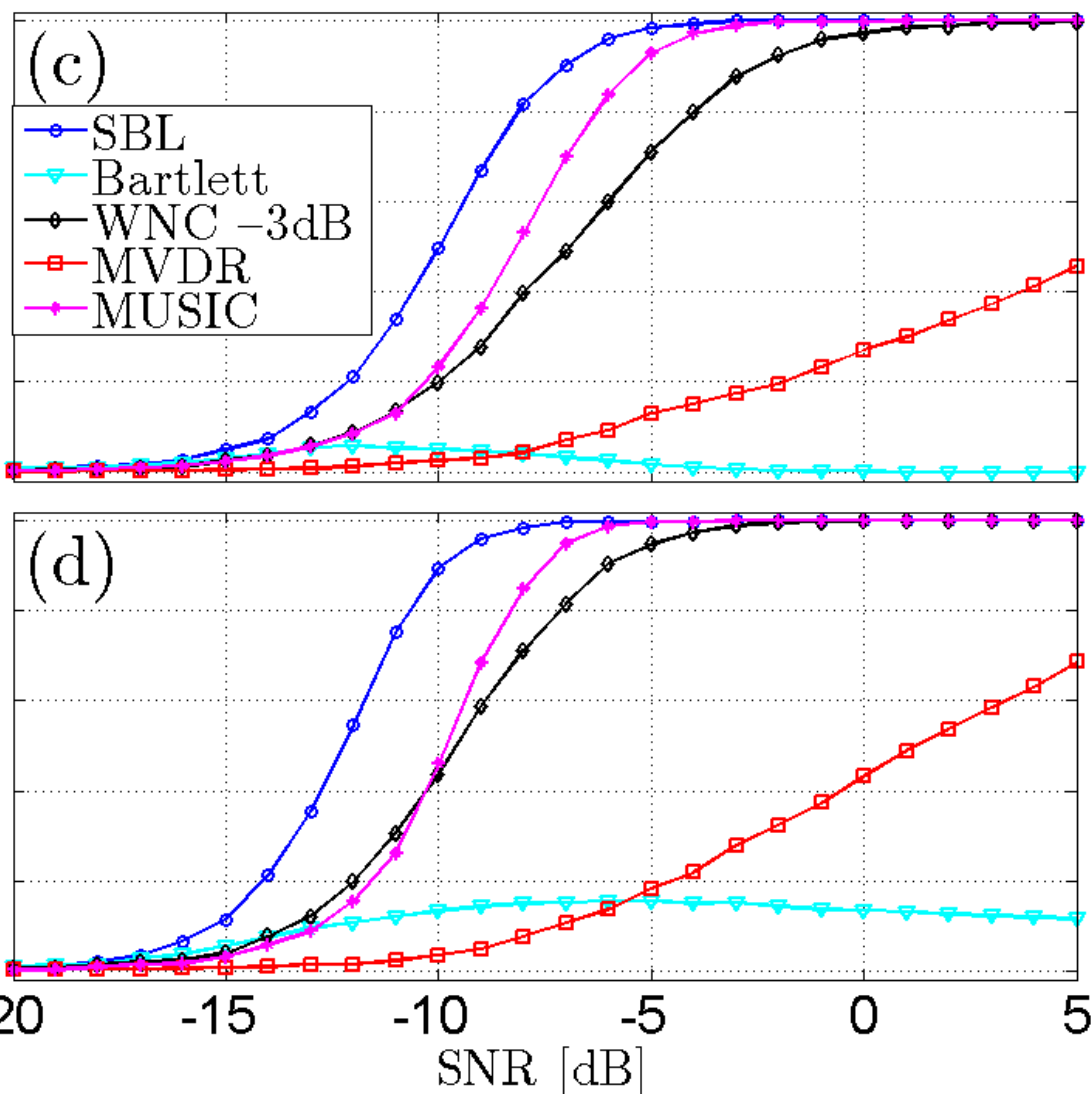
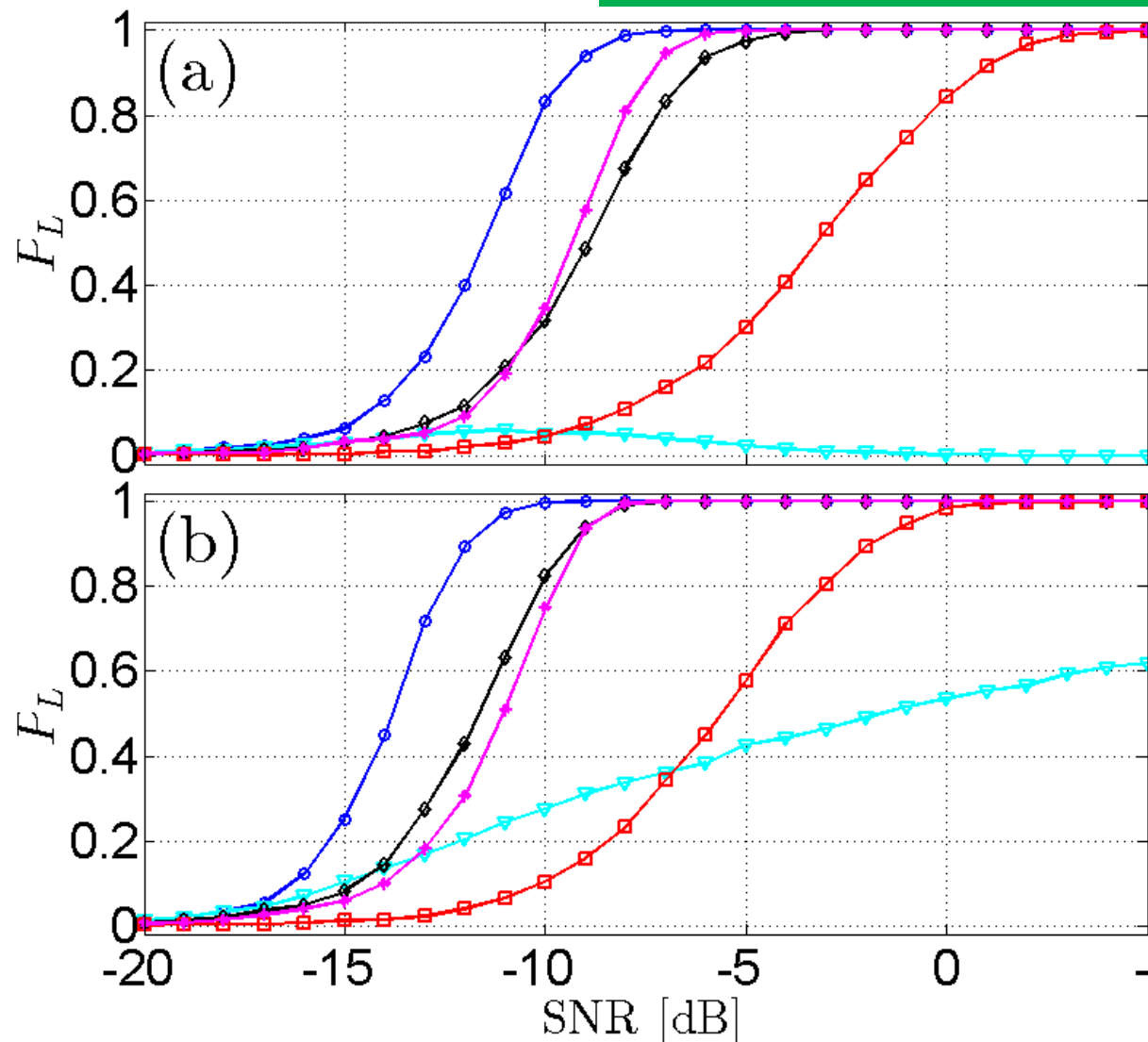
# Simulations

## 166 & 201 Hz

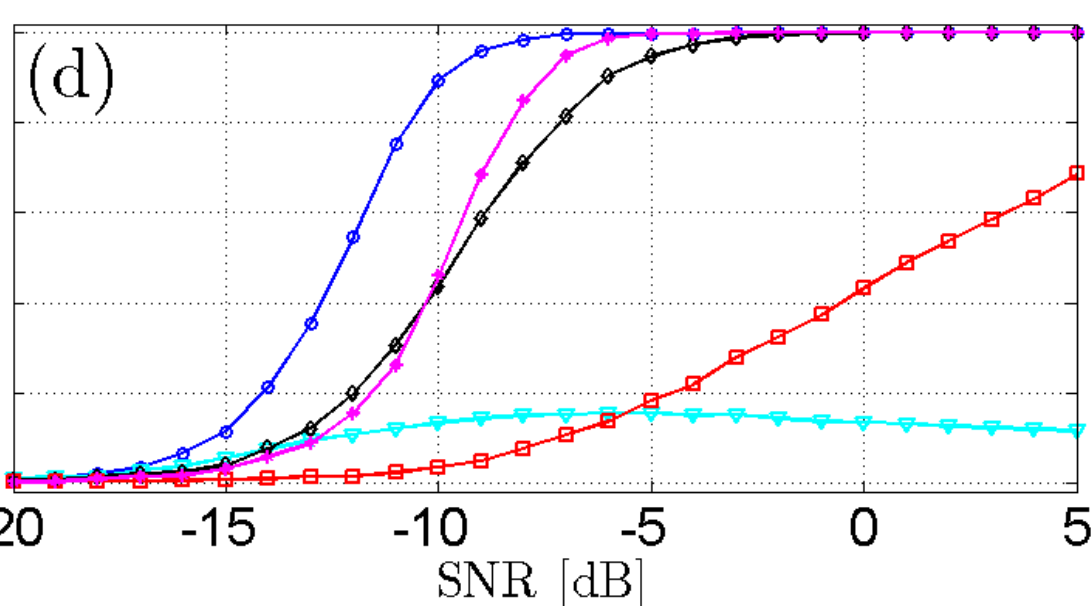
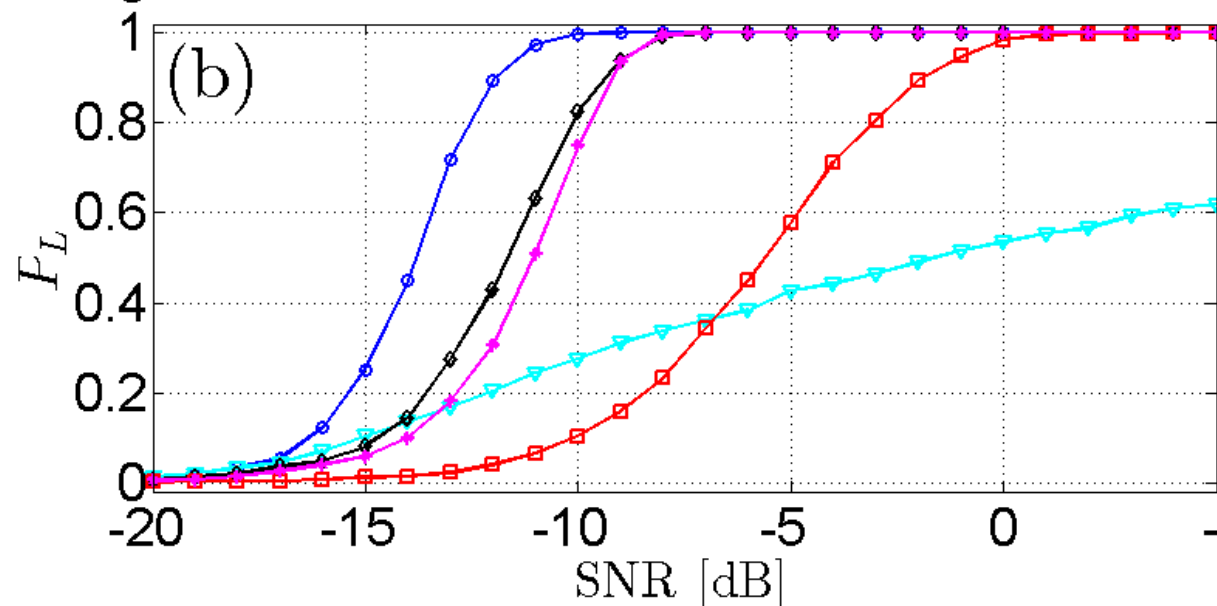
No mismatch

1° tilt mismatch

1F



2F

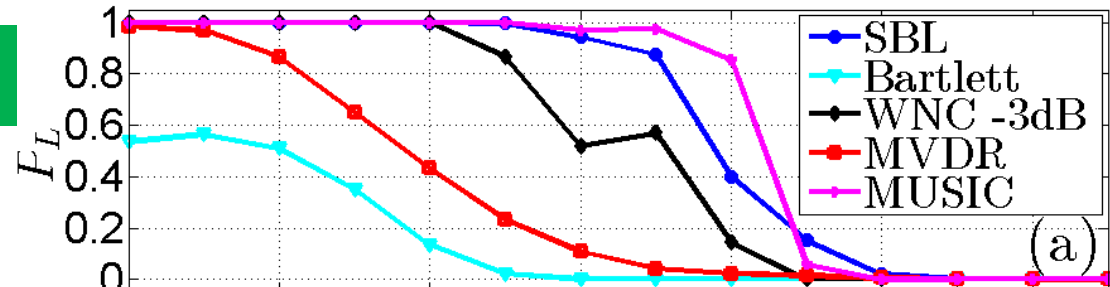


# Simulations 166 Hz and 201 Hz

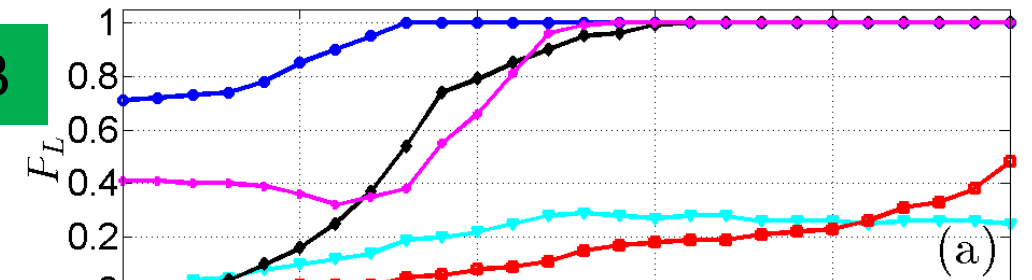
## SNR vs mismatch

## SNR f2 vs SNR f1

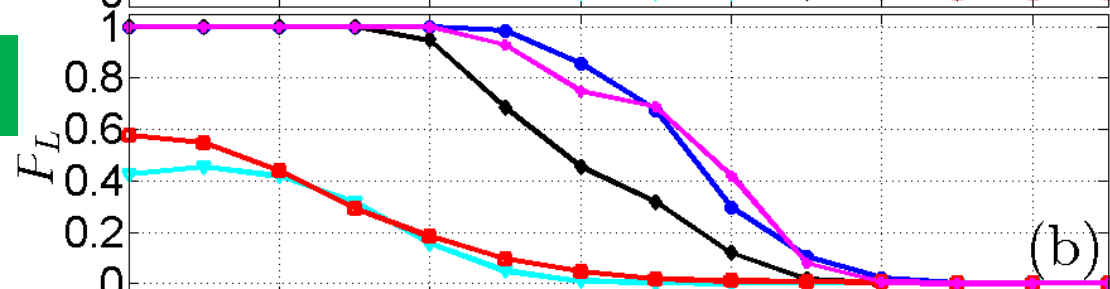
0 dB



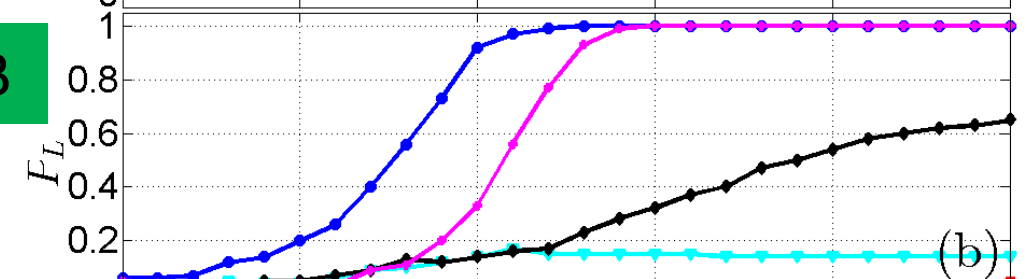
-10 dB



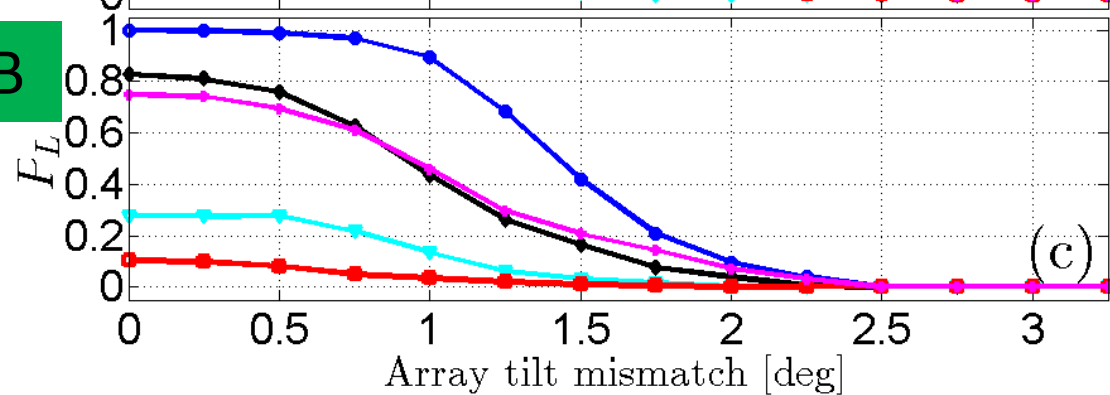
-5 dB



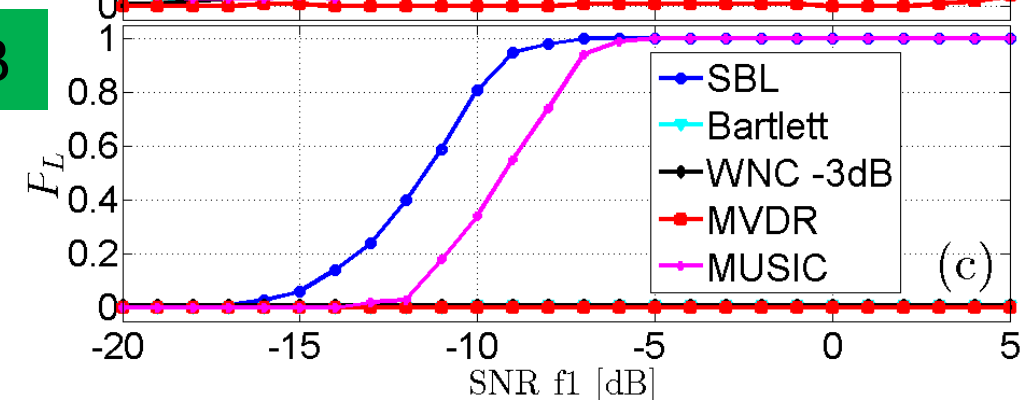
-15 dB



-10 dB



-20 dB

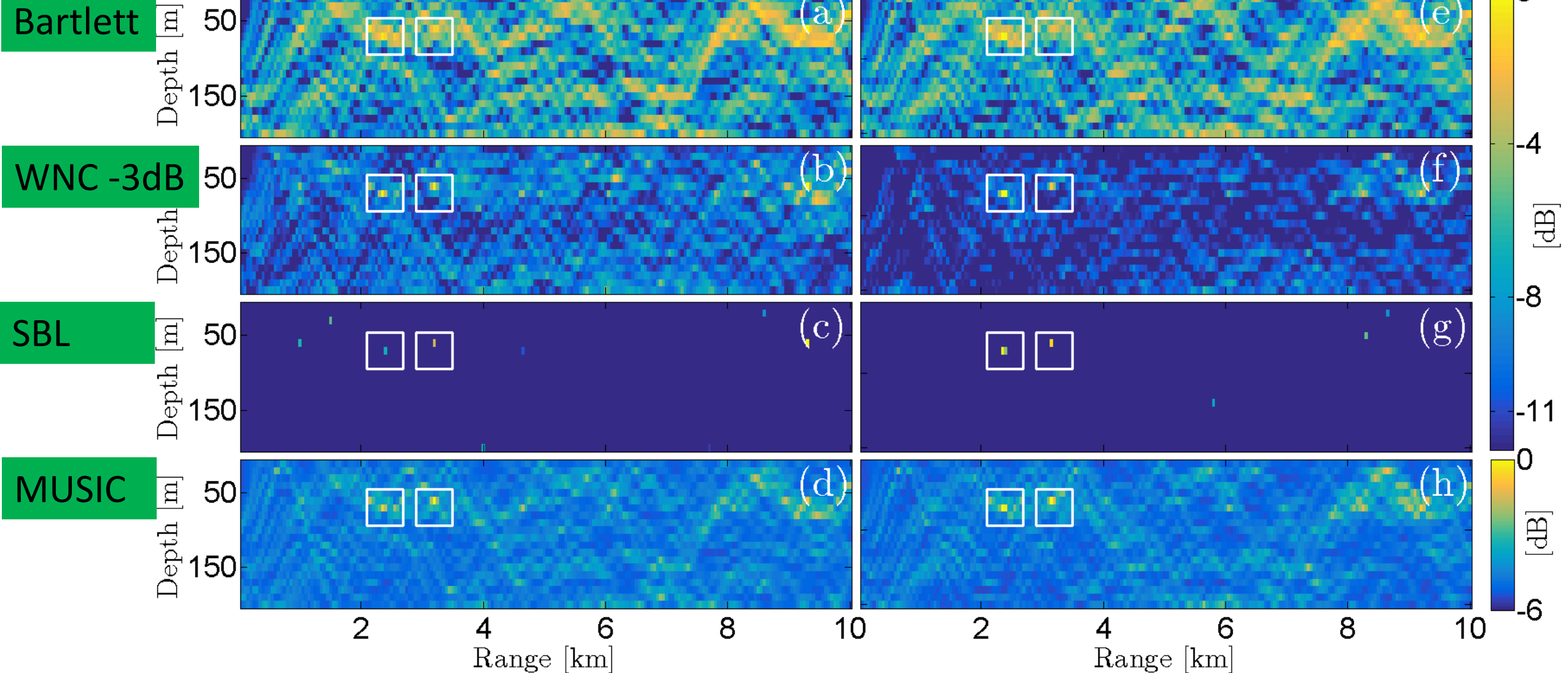




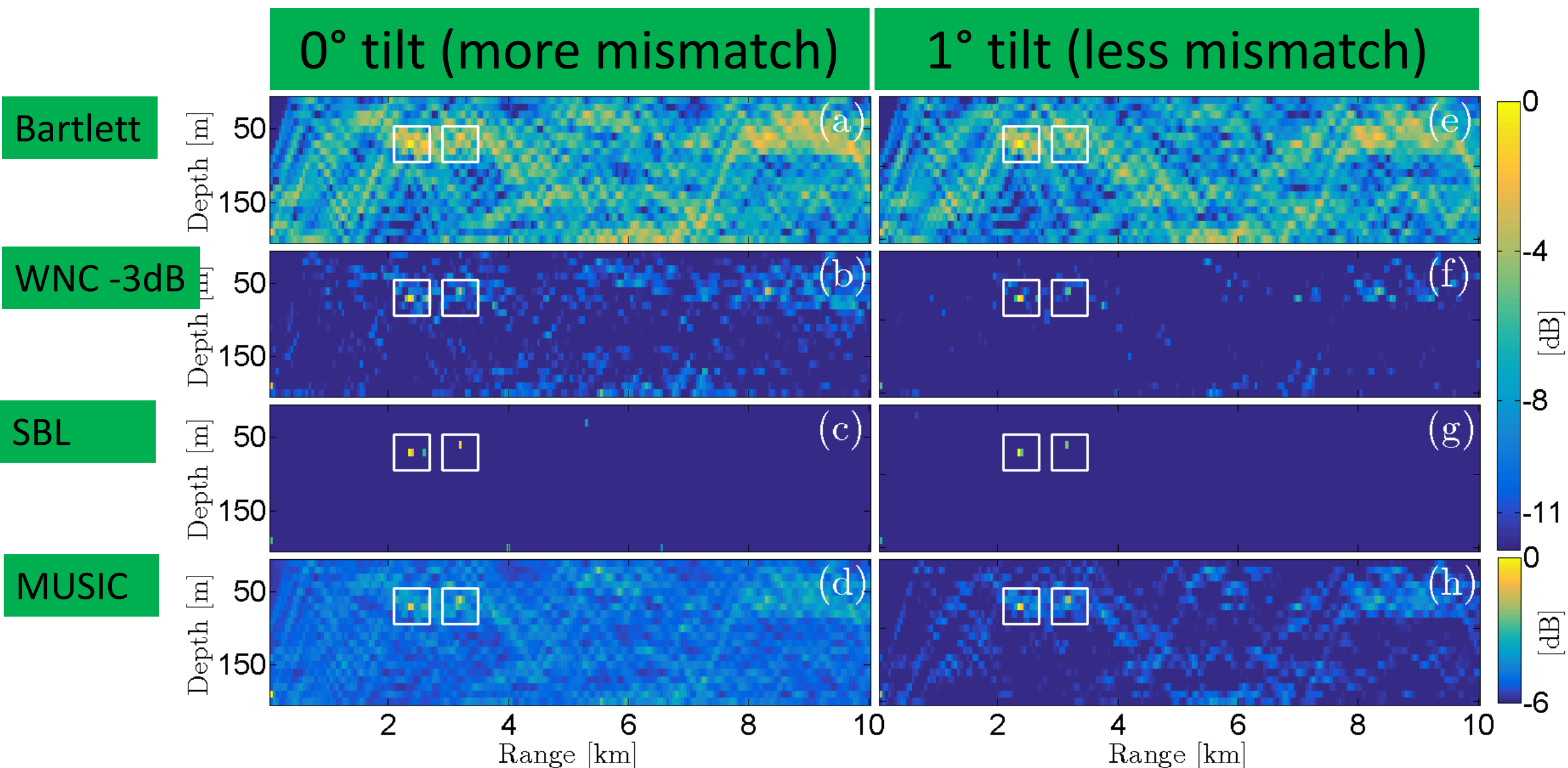
# SWellEx-96 2-Source Localization: 166 Hz

0° tilt (more mismatch)

1° tilt (less mismatch)



# SWellEx-96 2-Source Localization: 166 & 201 Hz





# SWellEx-96 Event S5 2-Source Localization

0° tilt (more mismatch)

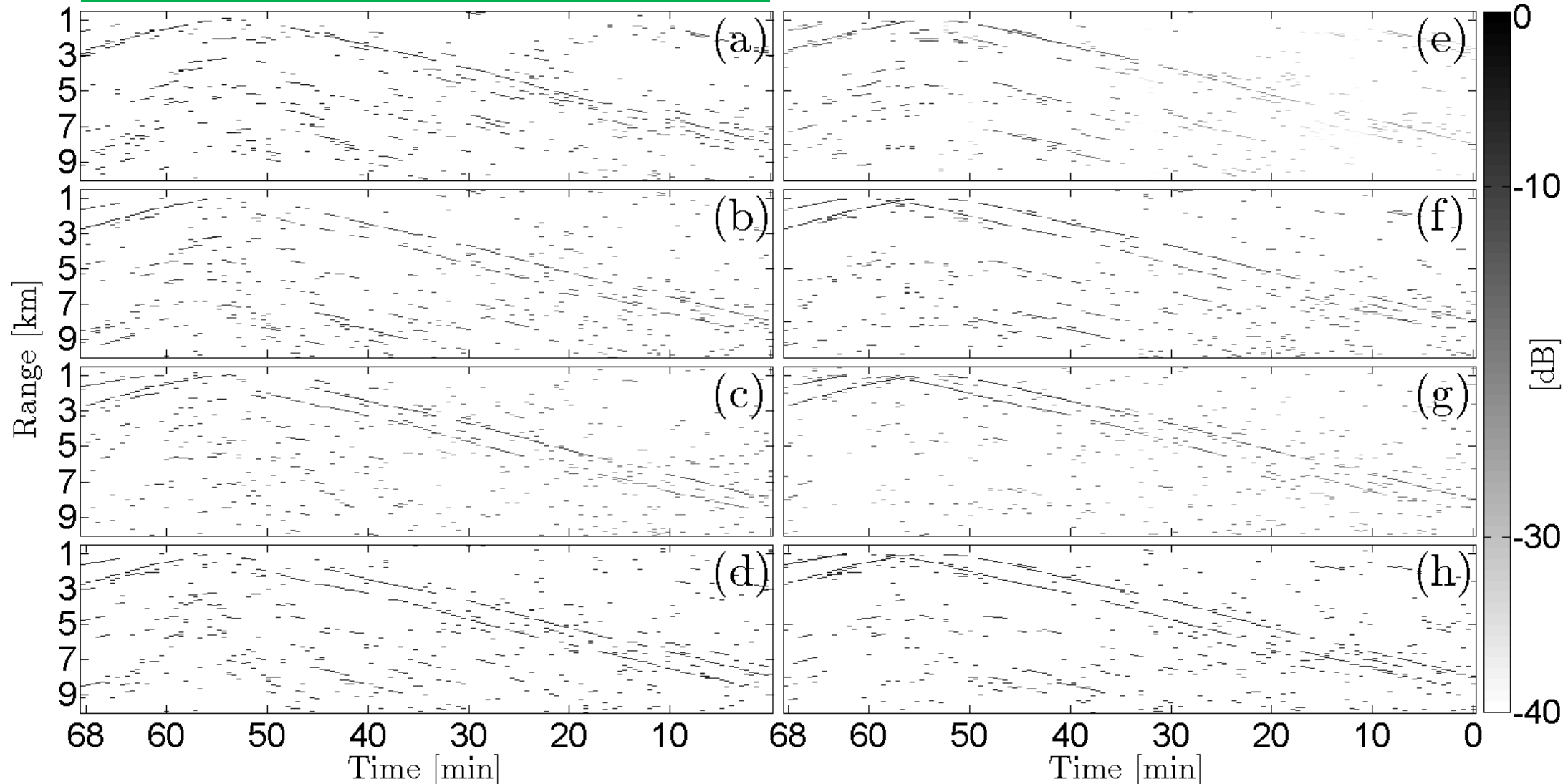
1° tilt (less mismatch)

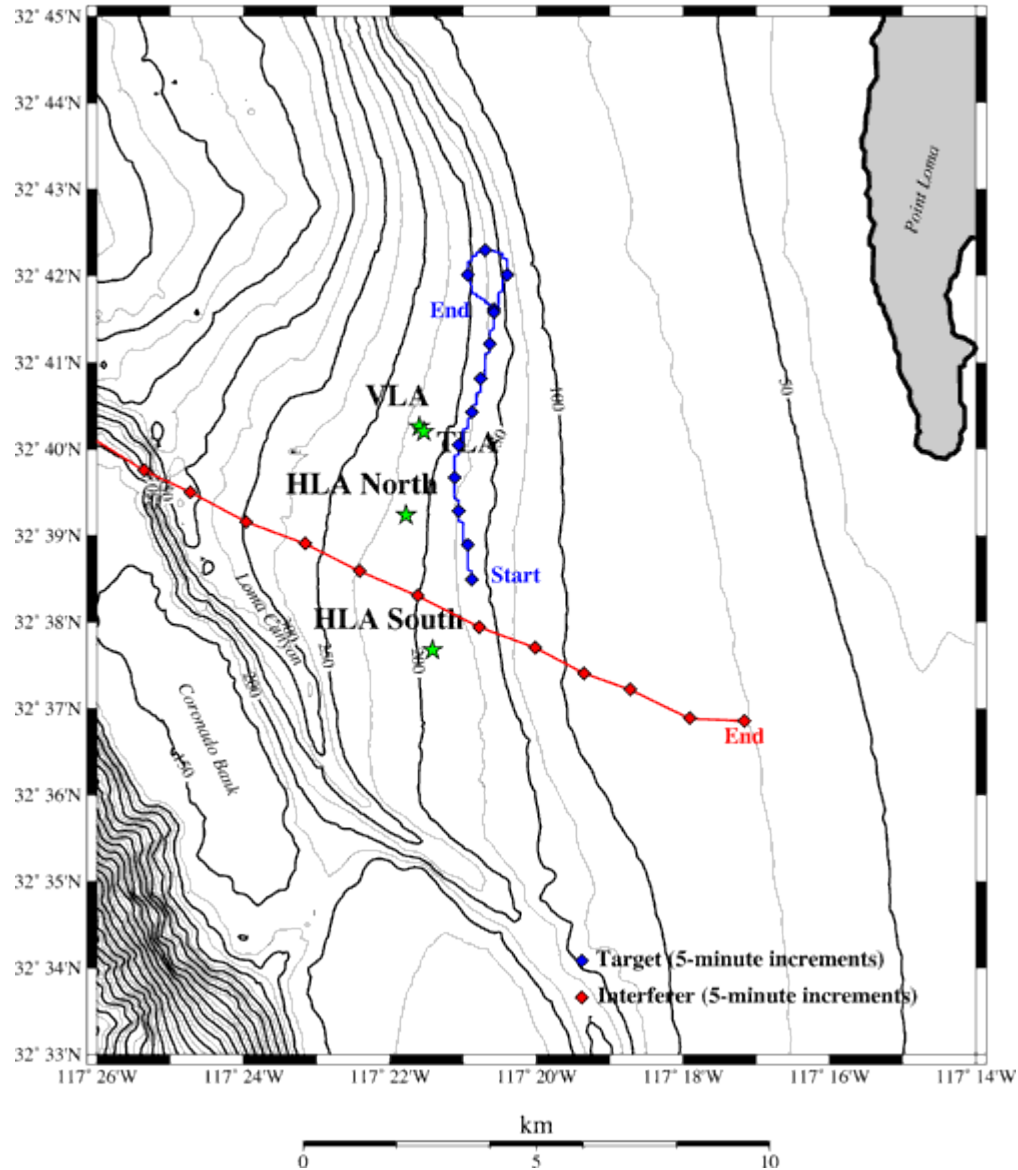
Bartlett

WNC -3dB

SBL

MUSIC

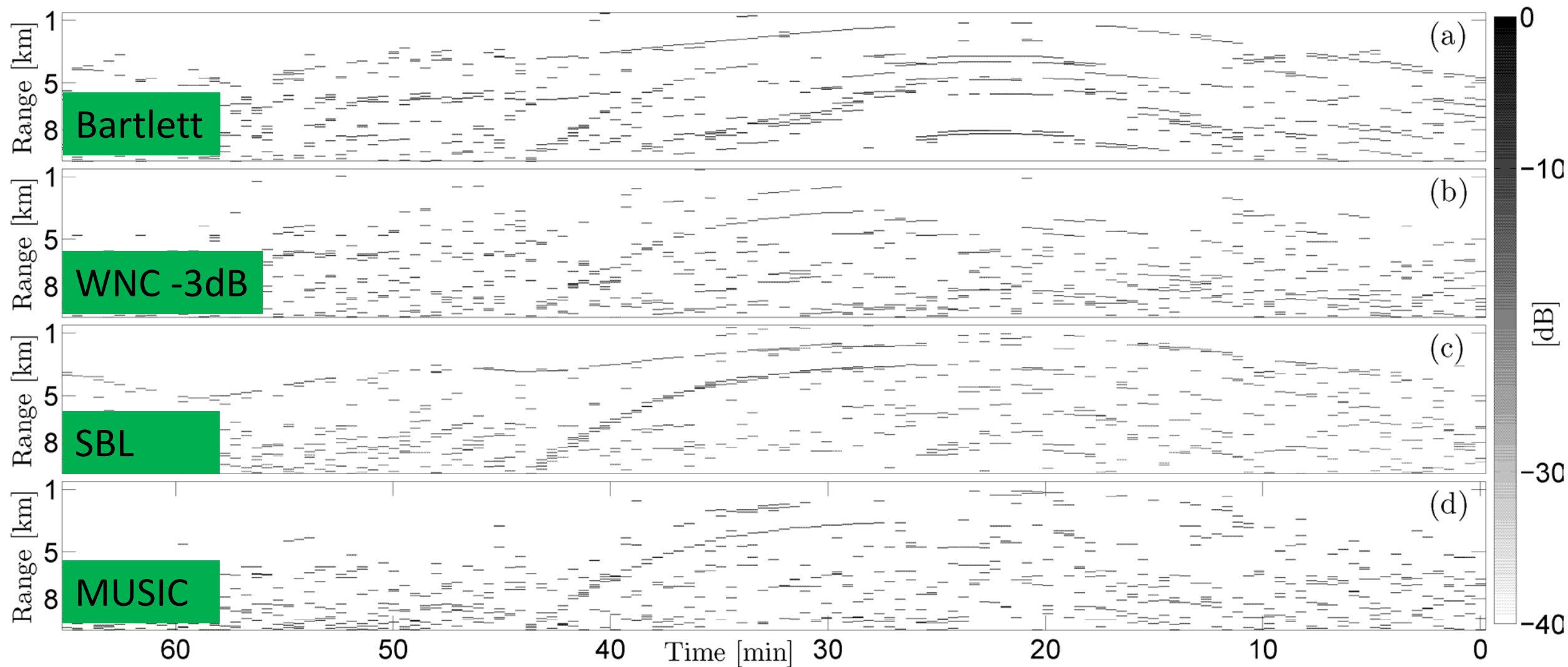




# SWellEx-96 Event S59:

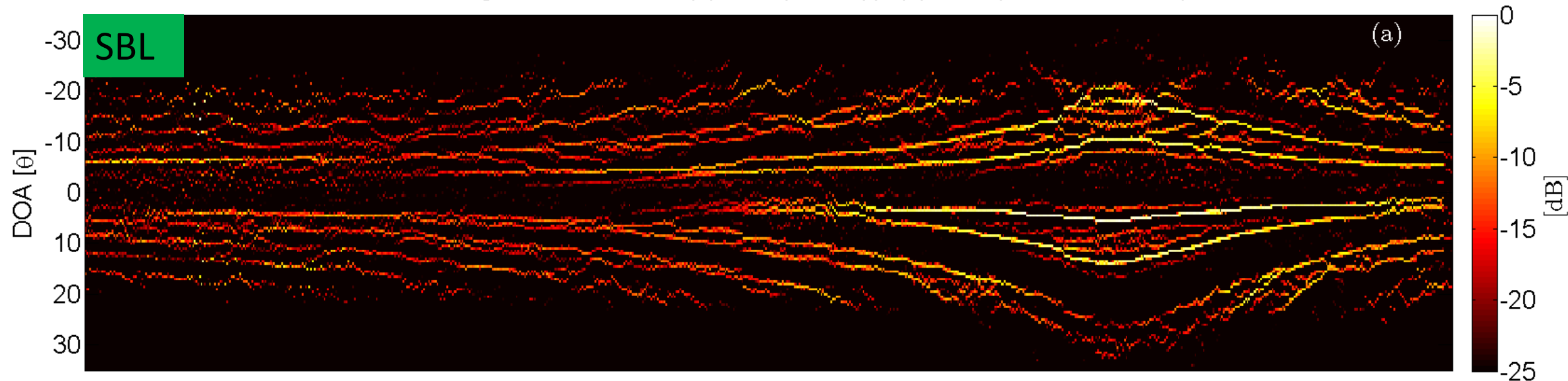
- 1 source (60 m) & 1 interferer (surface)
- 45 Processed Frequencies:
  - 166 201 Hz (top set at 158 dB)
  - Entire 2<sup>nd</sup> set (13 F at 132 dB)
  - +/- 1 bin
- FFT Length: 4096 samples
- Fs: 1500 Hz
- 21 Snapshots @ 50% overlap / segment

# Event S59: Deep Source with Surface Interferer

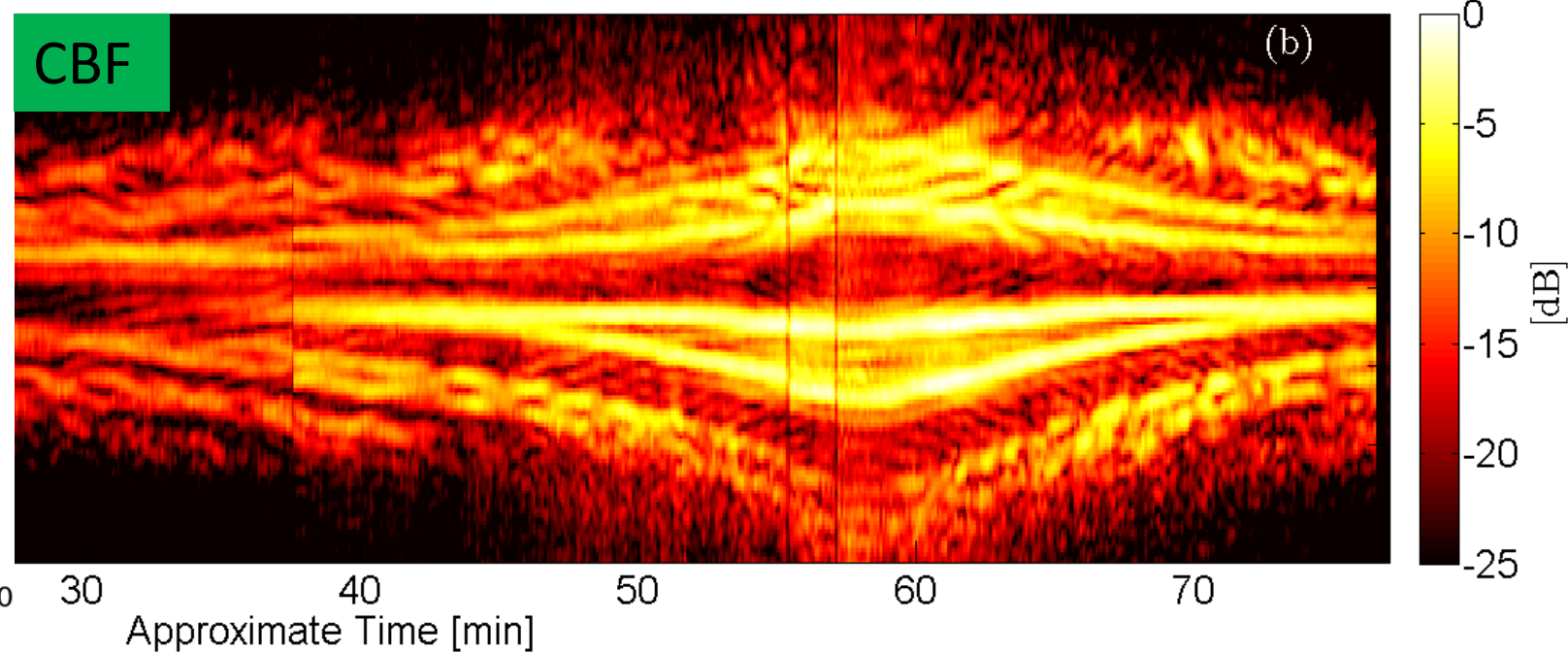
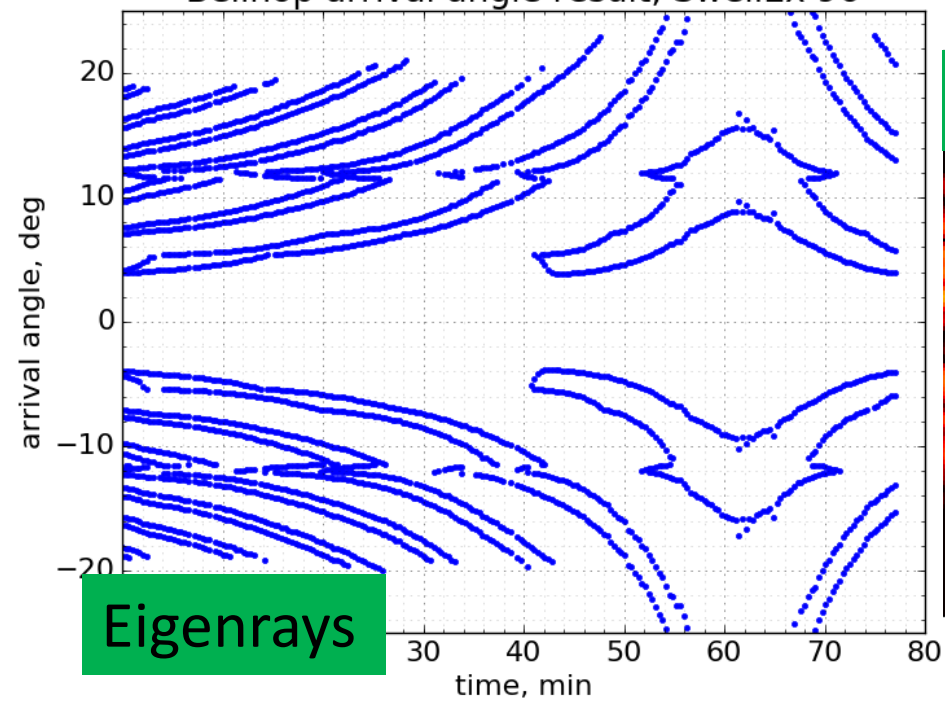


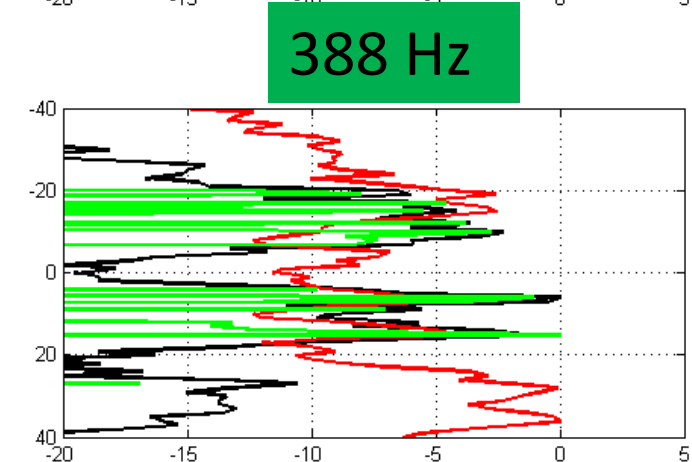
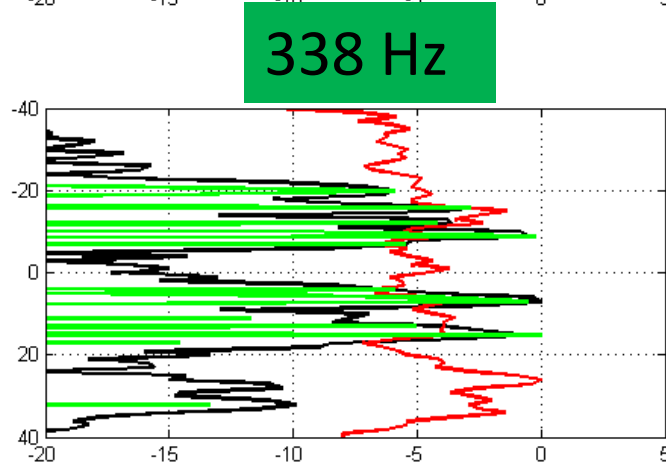
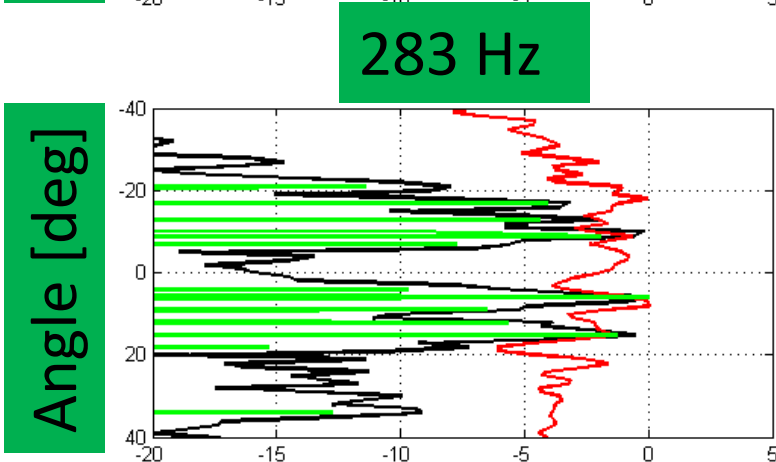
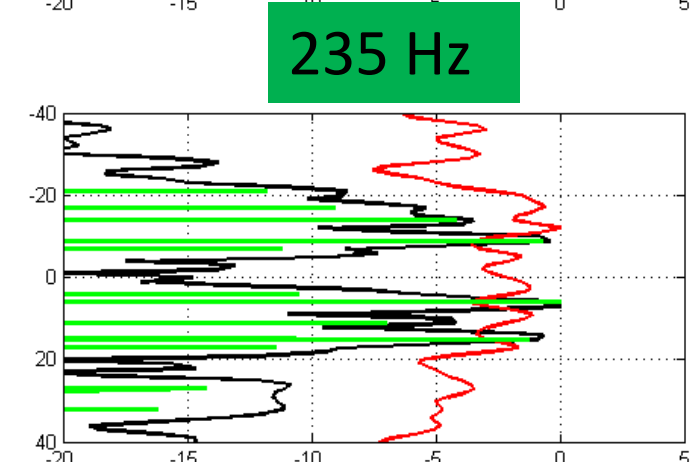
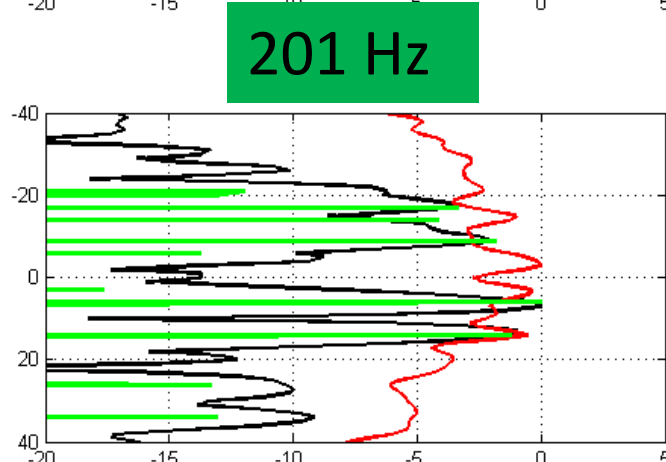
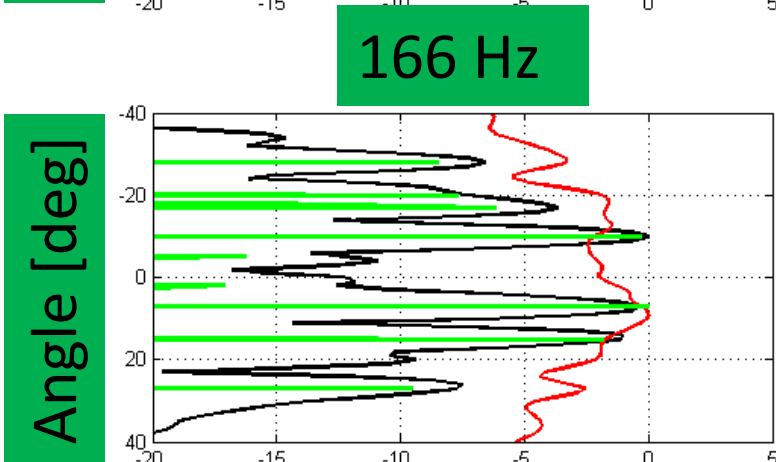
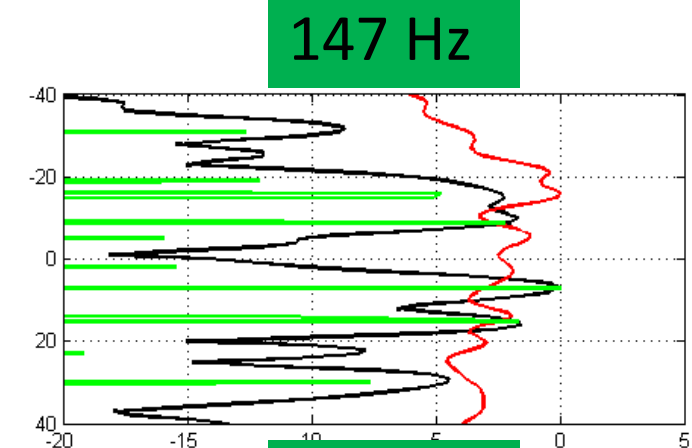
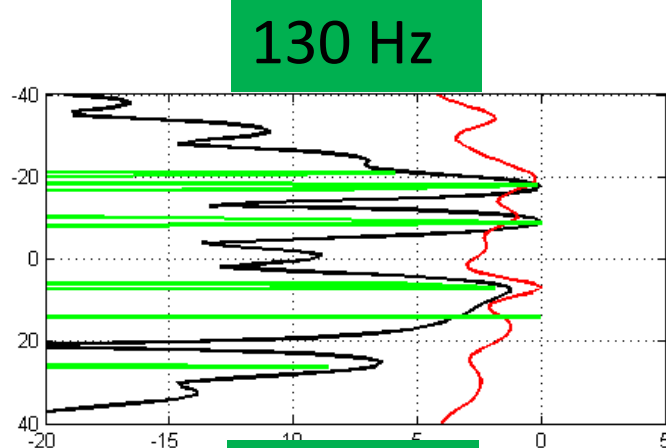
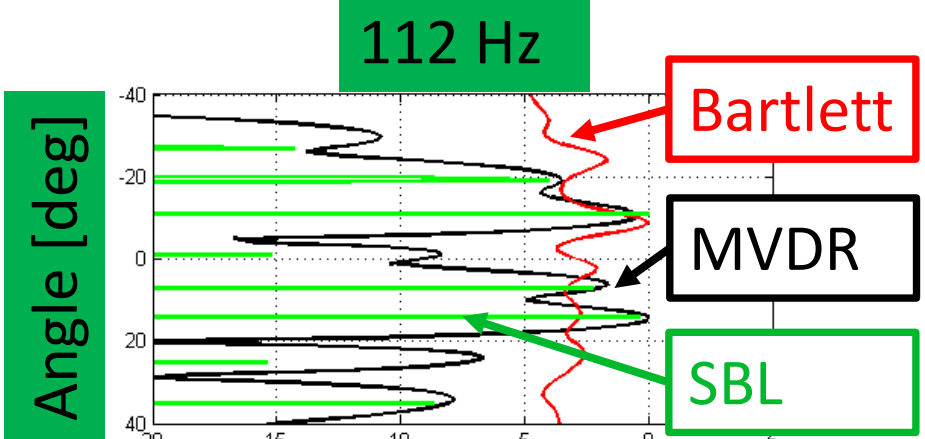


Beamforming SWellEx-96 S5: (a) SBL (13 freq.), (b) CBF (283 338 388 Hz)



Bellhop arrival angle result, SwellEx 96

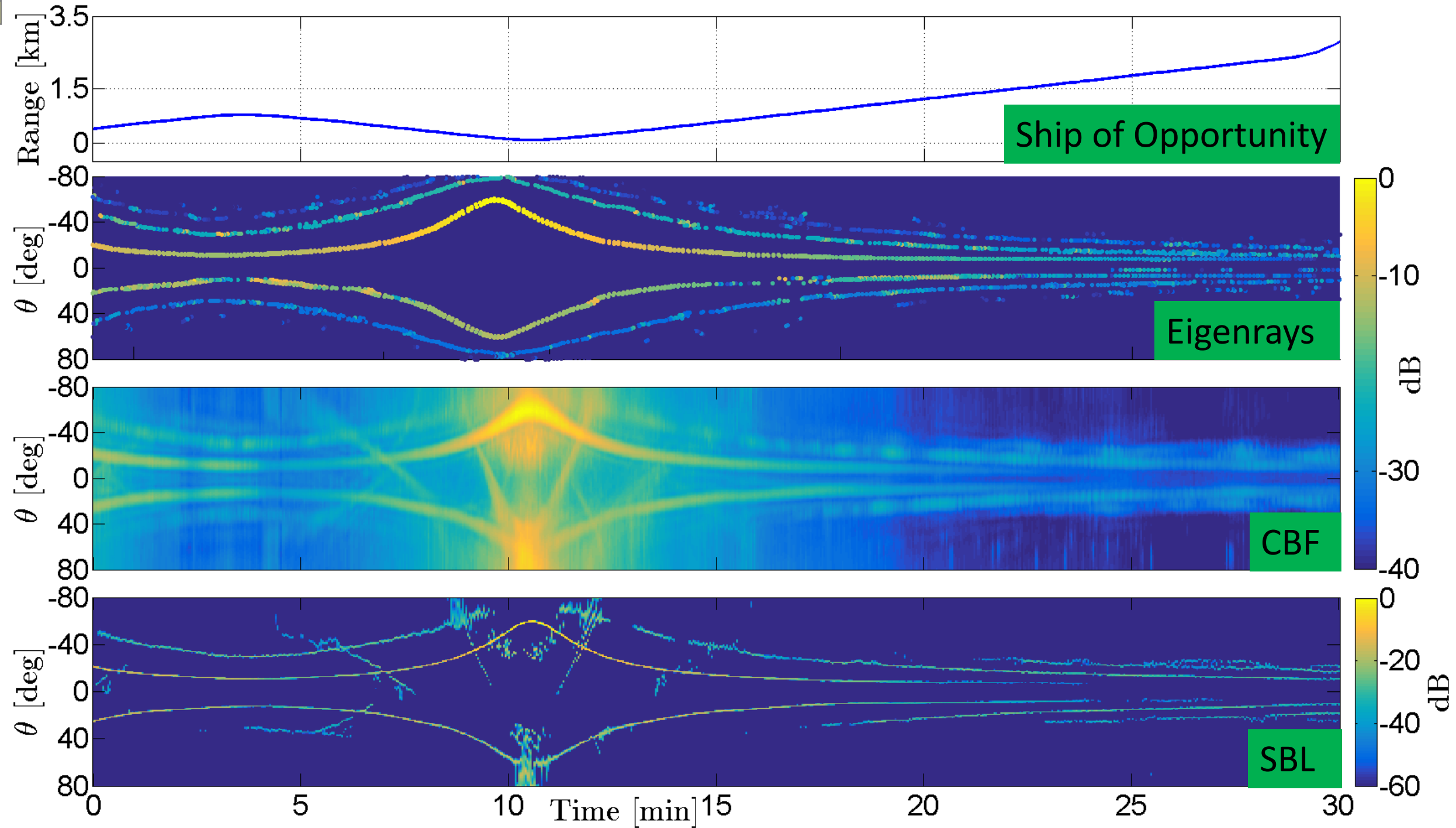




Power [dB]

Power [dB]

Power [dB]





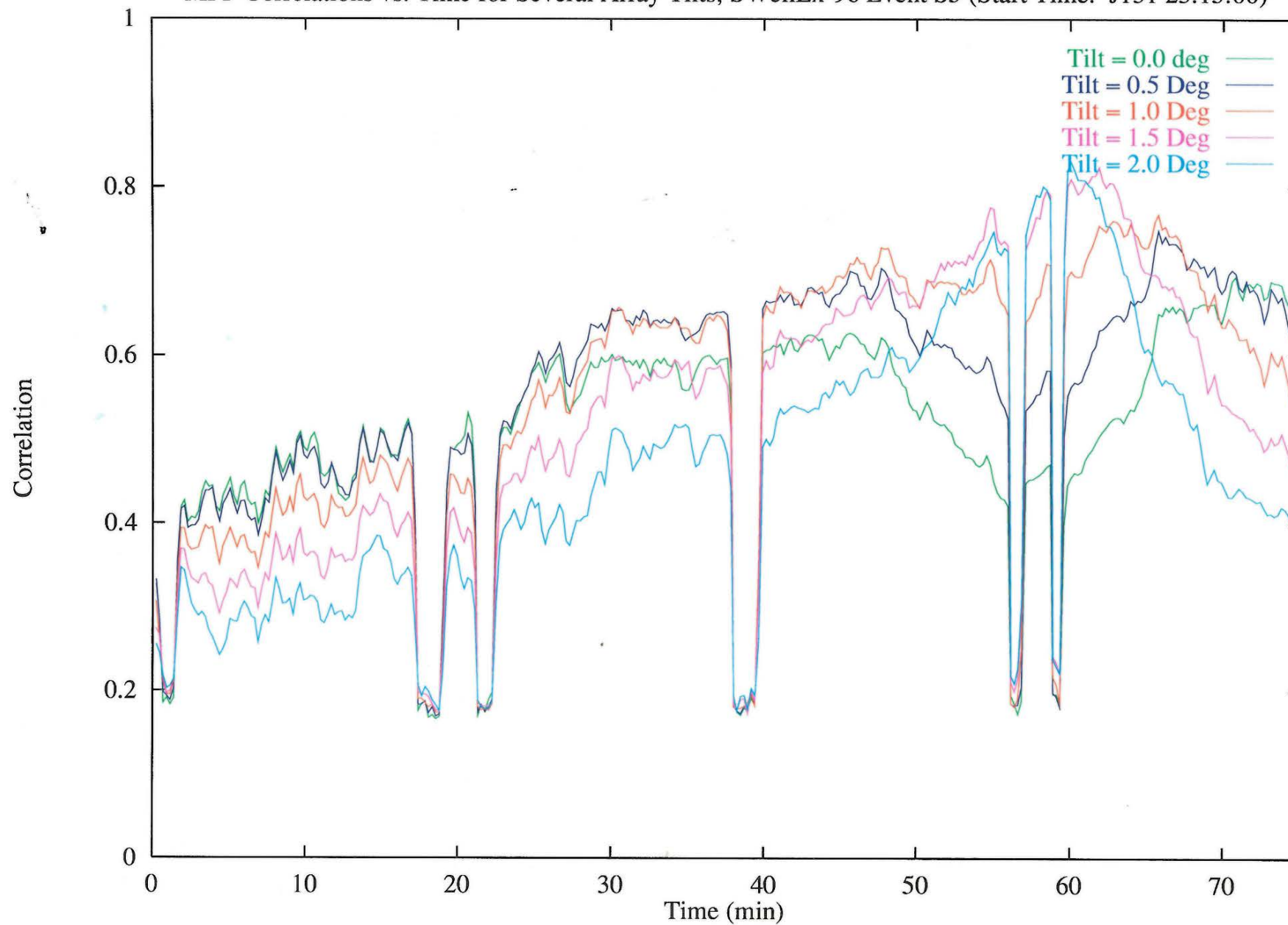


# Conclusions

- SBL behaves similarly to an adaptive processor and can discriminate against sidelobes. For MFP, SBL performance is comparable to MUSIC.
- SBL appears robust to modest data-replica mismatch demonstrated using array-tilt. It also appears robust in situations when multiple snapshots or frequencies correspond to adjacent range-depth cells at the expense of possible additional solutions (SBL yields an ambiguity surface).
- SBL requires less tuning than Basis Pursuit and is computationally faster.
- SBL appears as a convenient tool in identifying ray arrivals.

- End of presentation -

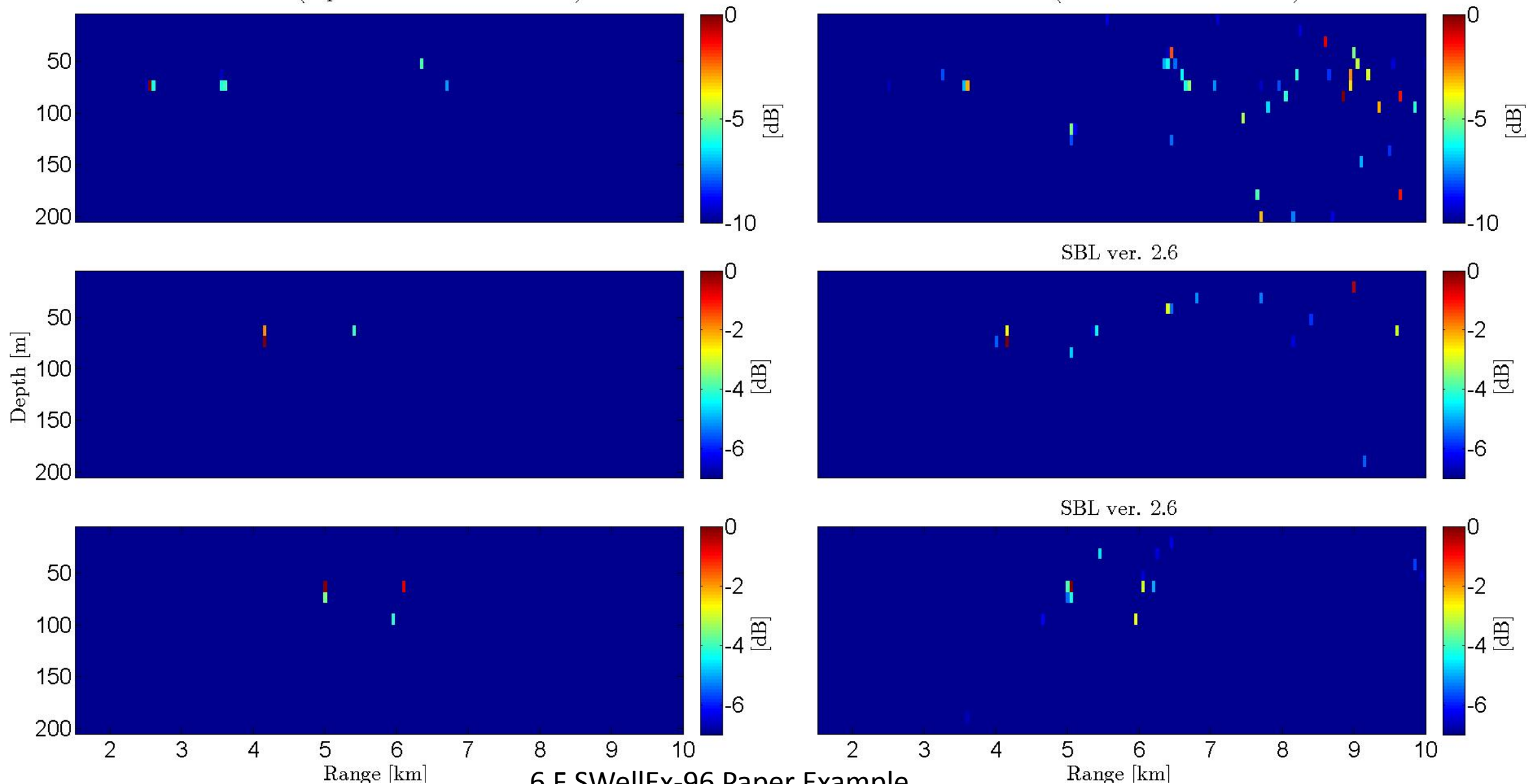
MFP Correlations vs. Time for Several Array Tilts; SWellEx-96 Event S5 (Start Time: J131 23:15:00)



# SBL MFP

SBL ver. 2.23 (explicit Nsources=1 for noise)

SBL ver. 2.6 (automatic noise estimate)



6 F SWellEx-96 Paper Example