## Sparsity in Multichannel Blind Deconvolution via Focusing Constraints

Pawan Bharadwaj (human), Laurent Demanet (human) and Aimé Fournier (human)

Massachusetts Institute of Technology

pawbz@mit.edu

March 12, 2019





### Green's Function Retrieval

#### Marmousi Model

- → Noise source:
  - → is uncontrollable and continuously inputs energy.
  - → likely is heavily correlated (not white spectrum) in time.
- → Imaging:
  - → from raw records is impossible because of unknown noise signature.
  - → requires the subsurface Green's function that is uncontaminated by noise.



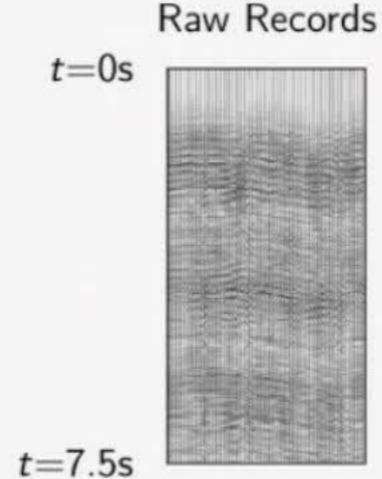
(Gradl et al. [2012])

Cycles Per Rotation

Drill Noise Spectrum

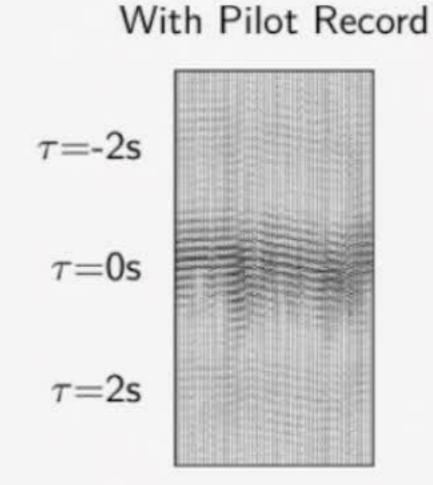
# Focused Blind Deconvolution (FBD)

#### Marmousi Model



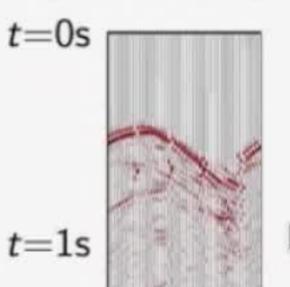


t=0s



Cross-correlation

Green's Function



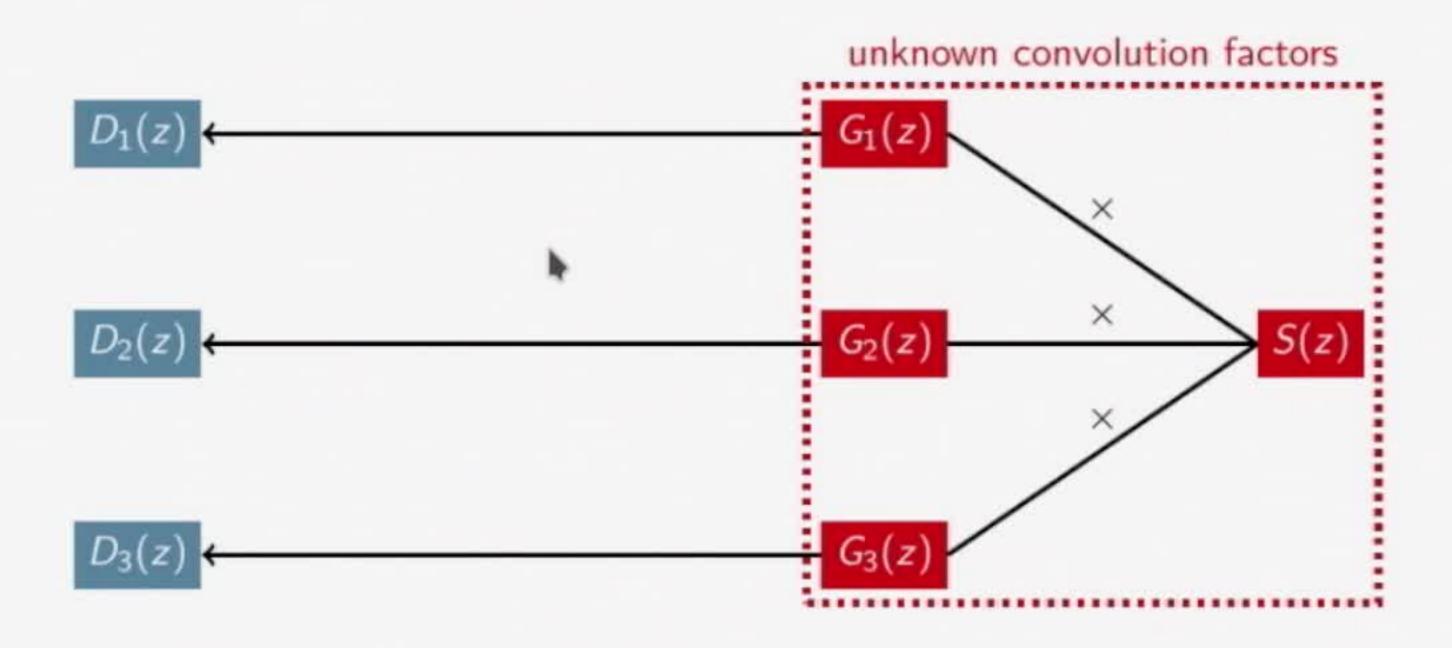
t=1s

FBD of Noise

### **Next Section**

- Multichannel Blind Deconvolution
  - Why not  $\ell_1$ ?
- (2) Interferometric Blind Deconvolution
- 3 Phase Retrieval
- Focused Blind Deconvolution
- 6 Conclusions

## Convolutional Model For Three Channels



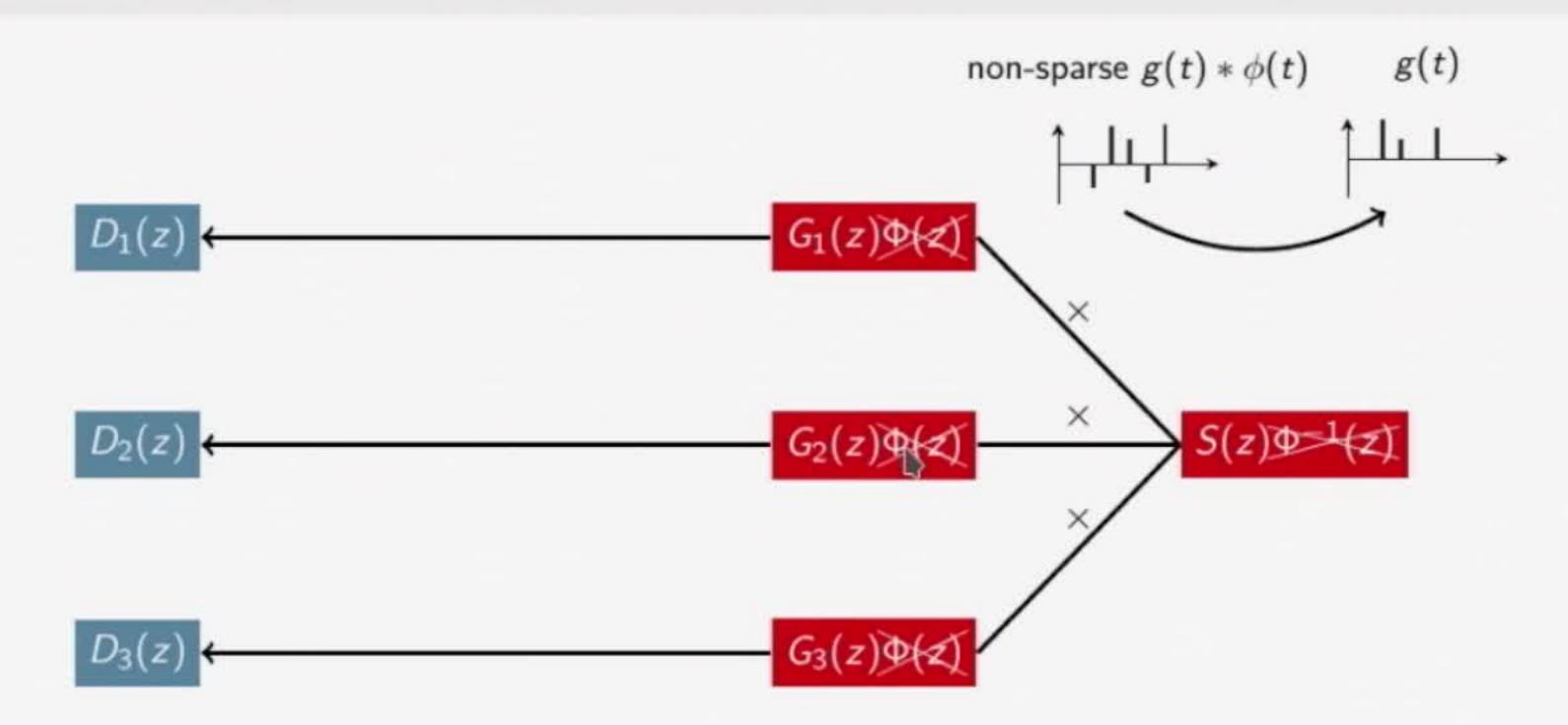
### **Next Subsection**

- Multichannel Blind Deconvolution
  Why not  $\ell_1$ ?
- Interferometric Blind Deconvolution
- 3 Phase Retrieval
- Focused Blind Deconvolution
- Conclusions

## Convolutional Model For Three Channels



### We Need Constraints to Remove Common Roots

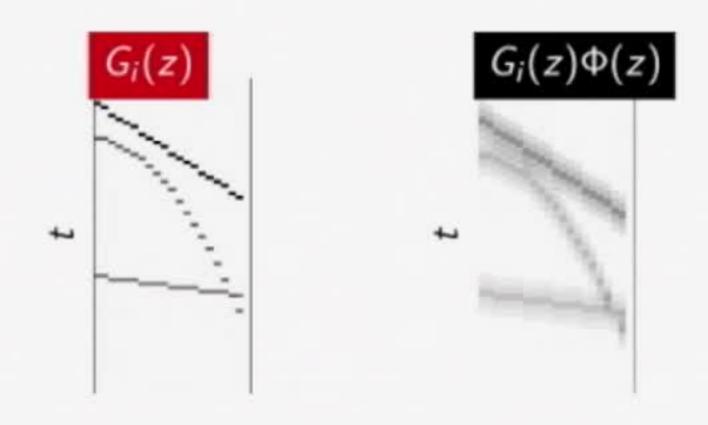


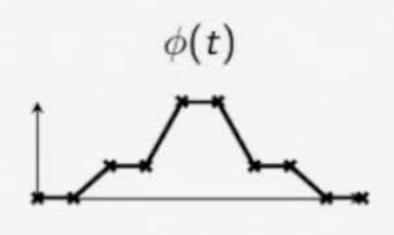
## $\ell_1$ Minimization Is Not Sufficient

 $\Rightarrow$  minimize  $\ell_1$  norm (Kazemi & Sacchi [2014], Nose-Filho et al. [2015], Liu et al. [2016]):

$$\min \sum_i \|g_i\|_1 \quad \text{s. t.} \quad d_i = g_i * s.$$

$$\sum_{i} ||g_{i}||_{1} = \sum_{i} ||g_{i} * \phi||_{1}$$
 whenever 
$$\int_{t} \phi(t) = 1$$

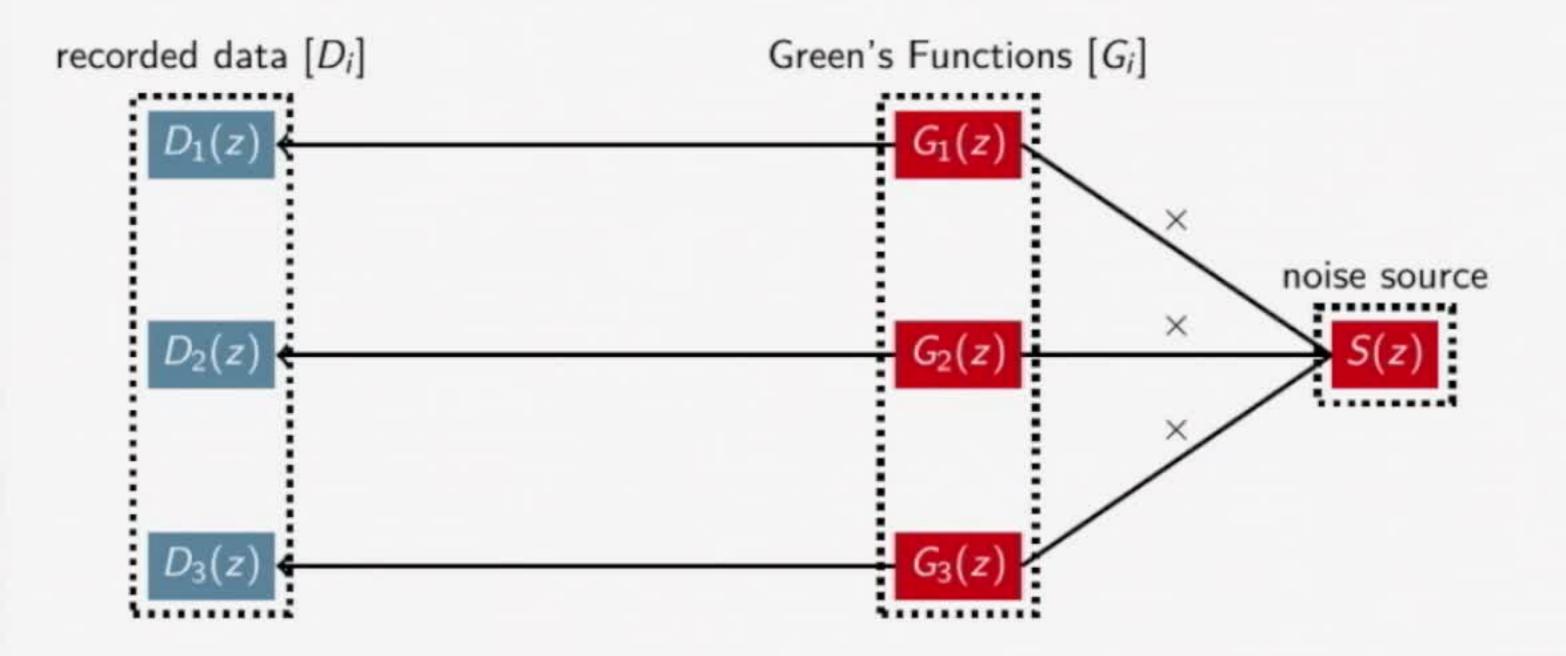




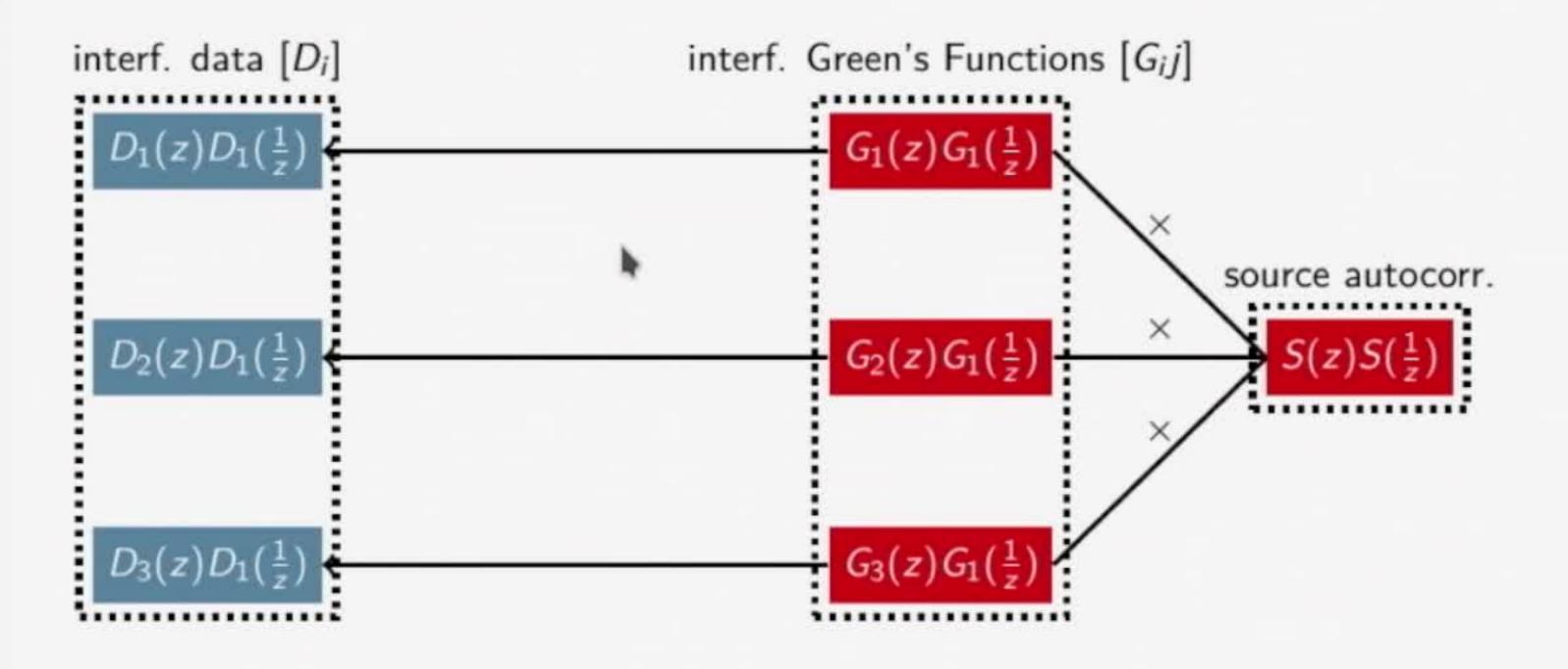
### **Next Section**

- Multichannel Blind Deconvolution
   Why not ℓ<sub>1</sub>?
- 2 Interferometric Blind Deconvolution
- 3 Phase Retrieval
- Focused Blind Deconvolution
- 6 Conclusions

### Convolutional Model For Three Channels



#### Interferometric Convolutional Model For Three Channels

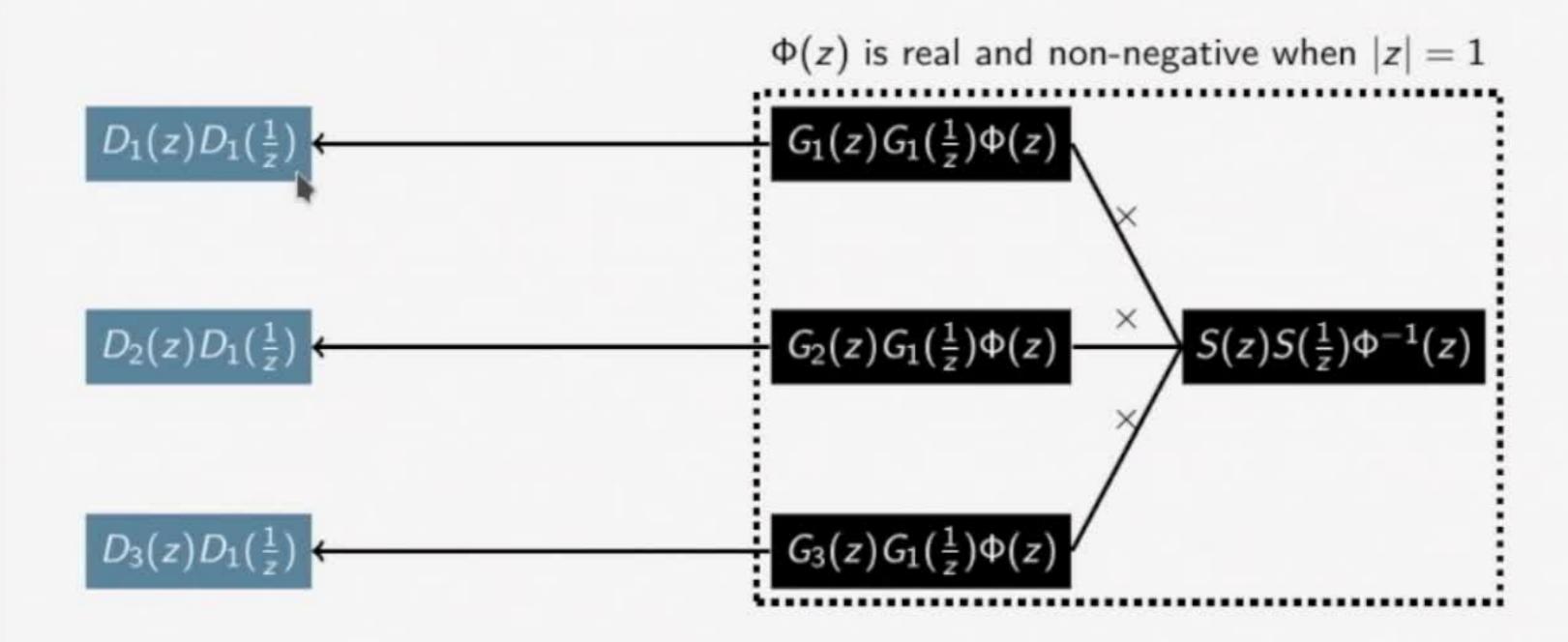


### Interferometric Blind Deconvolution

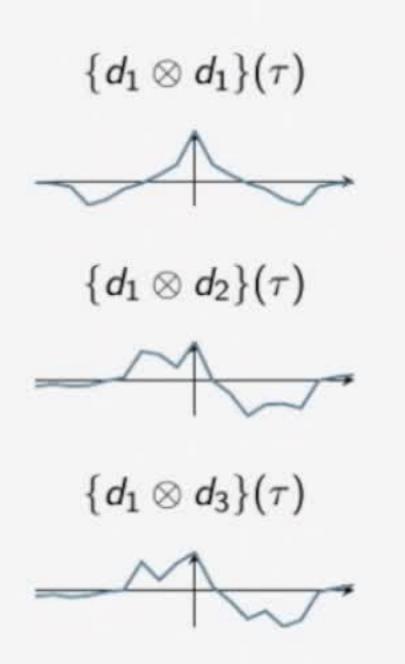
#### Definition

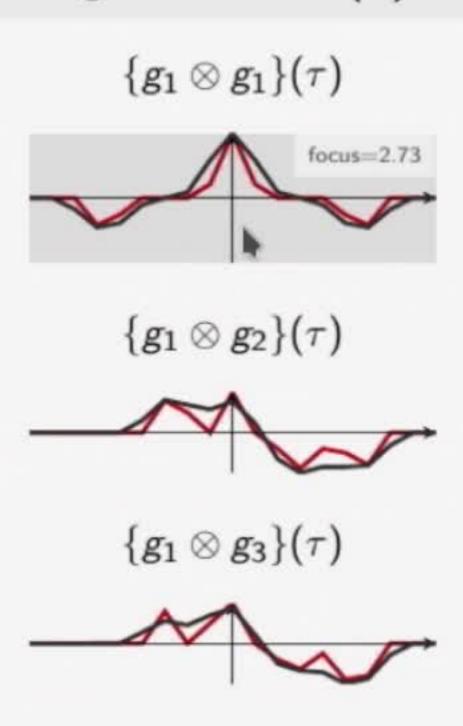
$$\arg\min\sum_{k,l}\sum_{\tau}\{\{d_k\otimes d_l\}(\tau)-\{\{s\otimes s\}*\{g_k\otimes g_l\}\}(\tau)\}^2+\alpha\sum_{k}\sum_{\tau}t^2\{g_k\otimes g_k\}^2(\tau)$$

# $\Phi(z)$ in Interferometric Blind Deconvolution



# Undesired Solution 2: Defocusing Due To $\Phi(z)$







# Focusing · · ·

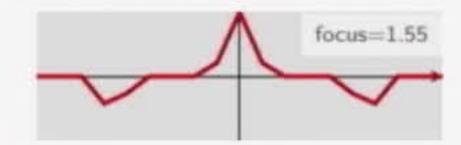
⇒ Focusing objective:

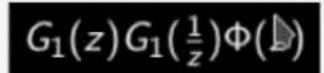
$$\sum_{k}\sum_{\tau}t^{2}\{g_{k}\otimes g_{k}\}^{2}(\tau).$$

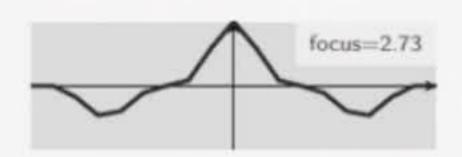
→ Theorem (Bharadwaj, Demanet & Fournier 2018):

lowest value of the focusing objective iff  $\phi(t) = \delta(t)$  among all  $\phi$  that cause indeterminacy.

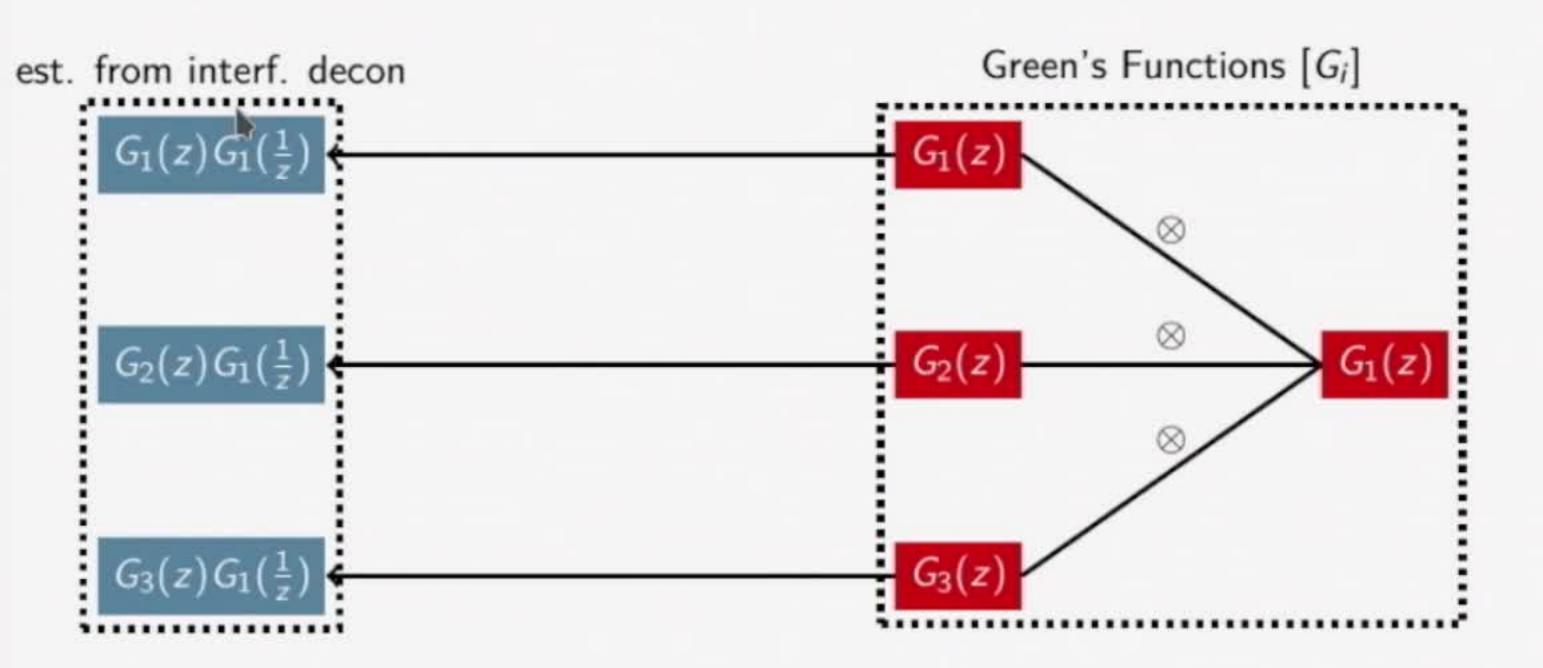




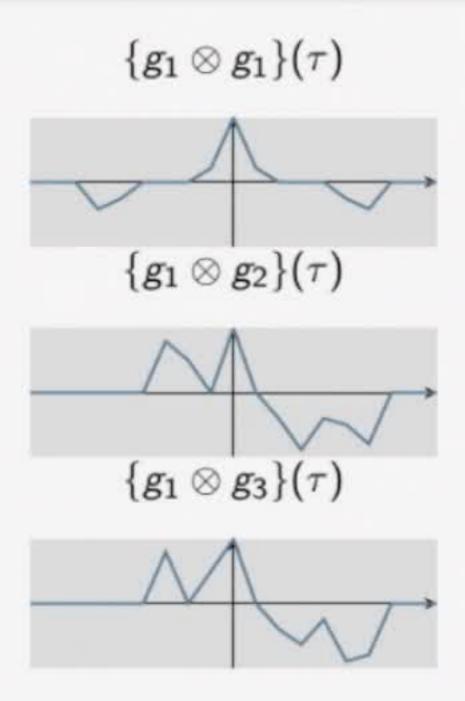


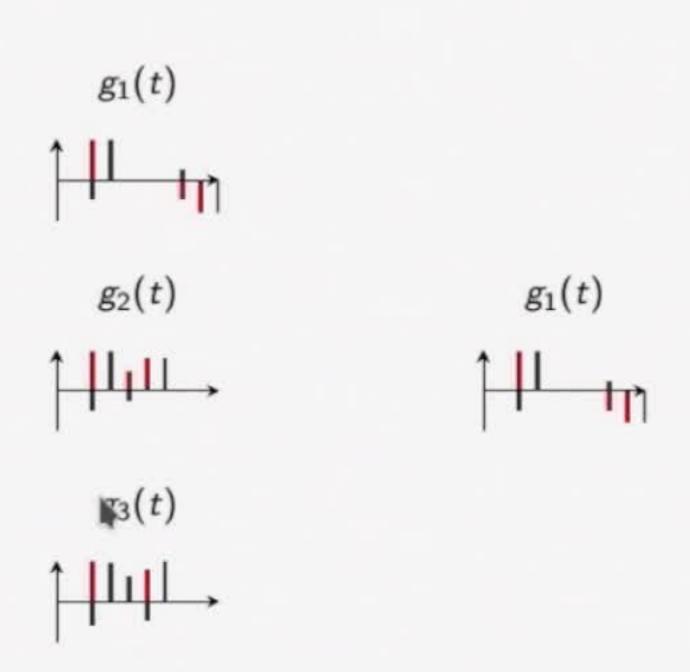


### Phase Retrieval

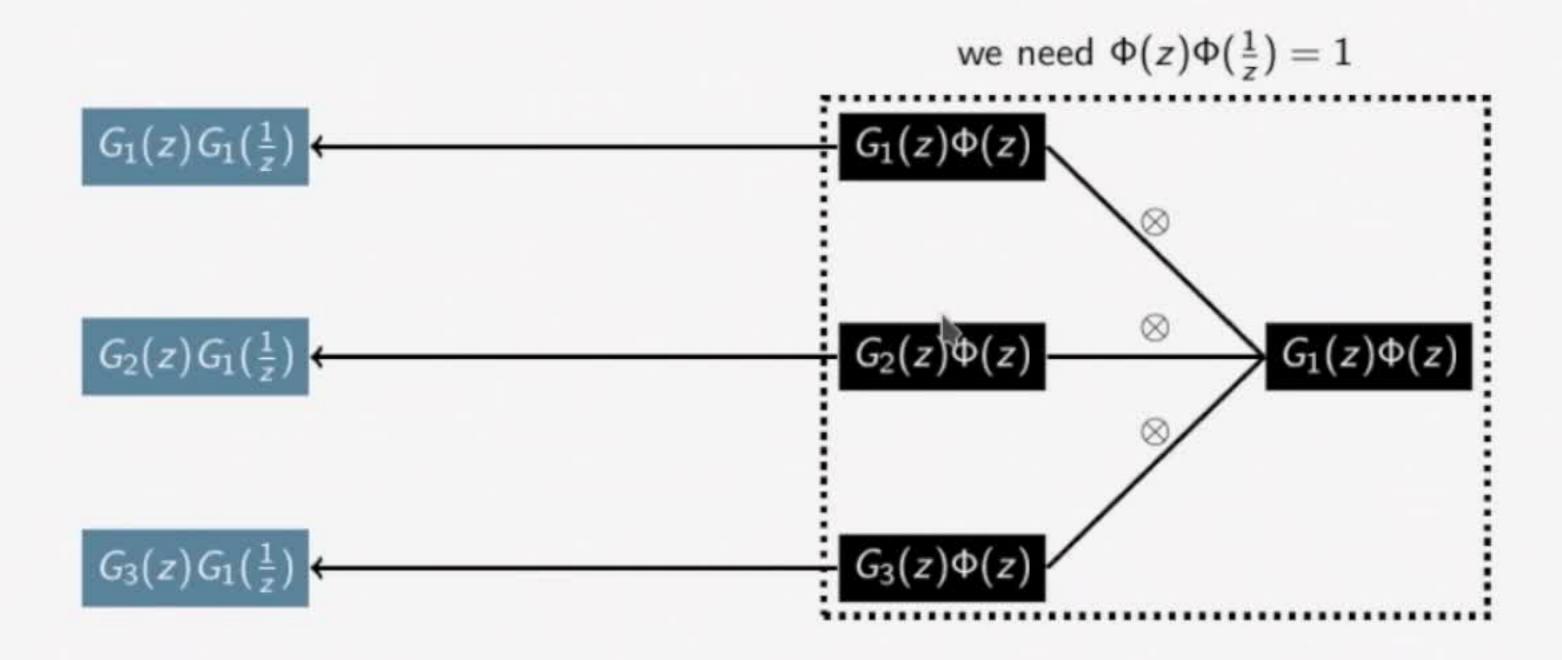


## Undesired Solution 1: Green's Function Not Front-loaded





# Undesired Green's Function: Unknown Phase Due to $\Phi(z)$



### Conclusions

#### Focused Blind Deconvolution:

- → achieves data-driven Green's function retrieval from the multi-channel seismic data of a noisy source.
- → and it doesn't demand either velocity model or unrealistic noisy-source assumptions.

#### Two Focusing Constraints:

- $\rightarrow$  resolve the indeterminacy due to the amplitude spectrum of  $\phi(t)$ , by choosing the Green's functions that are maximally white.
- $\rightarrow$  resolve the indeterminacy due to the phase spectrum of  $\phi(t)$ , by choosing the Green's functions that are maximally front-loaded.

## Acknowledgements

- → This project was funded by Equinor.
- → LD is also funded by AFOSR grants FA9550-12-1-0328 and FA9550-15-1-0078, ONR grant N00014-16-1-2122, NSF grant DMS-1255203.

