

# Medical Image Processing for Diagnostic Applications

## Parallel Beam – On Noise, Filtering and Window Functions

Online Course – Unit 35

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Pattern Recognition Lab (CS 5)



# Topics

## Effect of Noise on Filtering

### Window Functions

- General Idea

- Common Examples

- The According Filters

- Filter Results

### Summary

- Take Home Messages

- Further Readings

## Additive Noise (+2%)

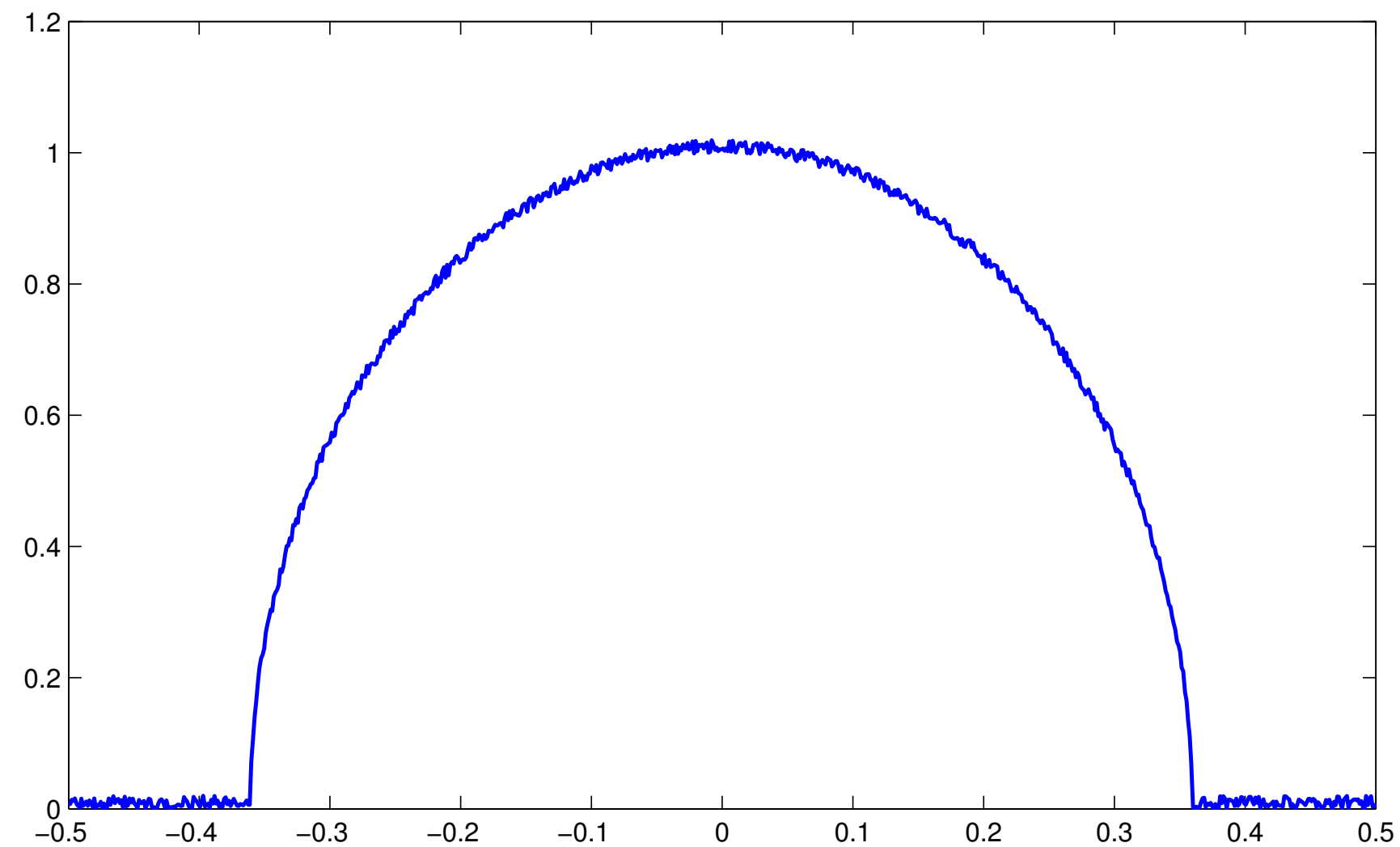


Figure 1: Projection of the cylinder phantom with 2% noise added

# Additive Noise (+2%)

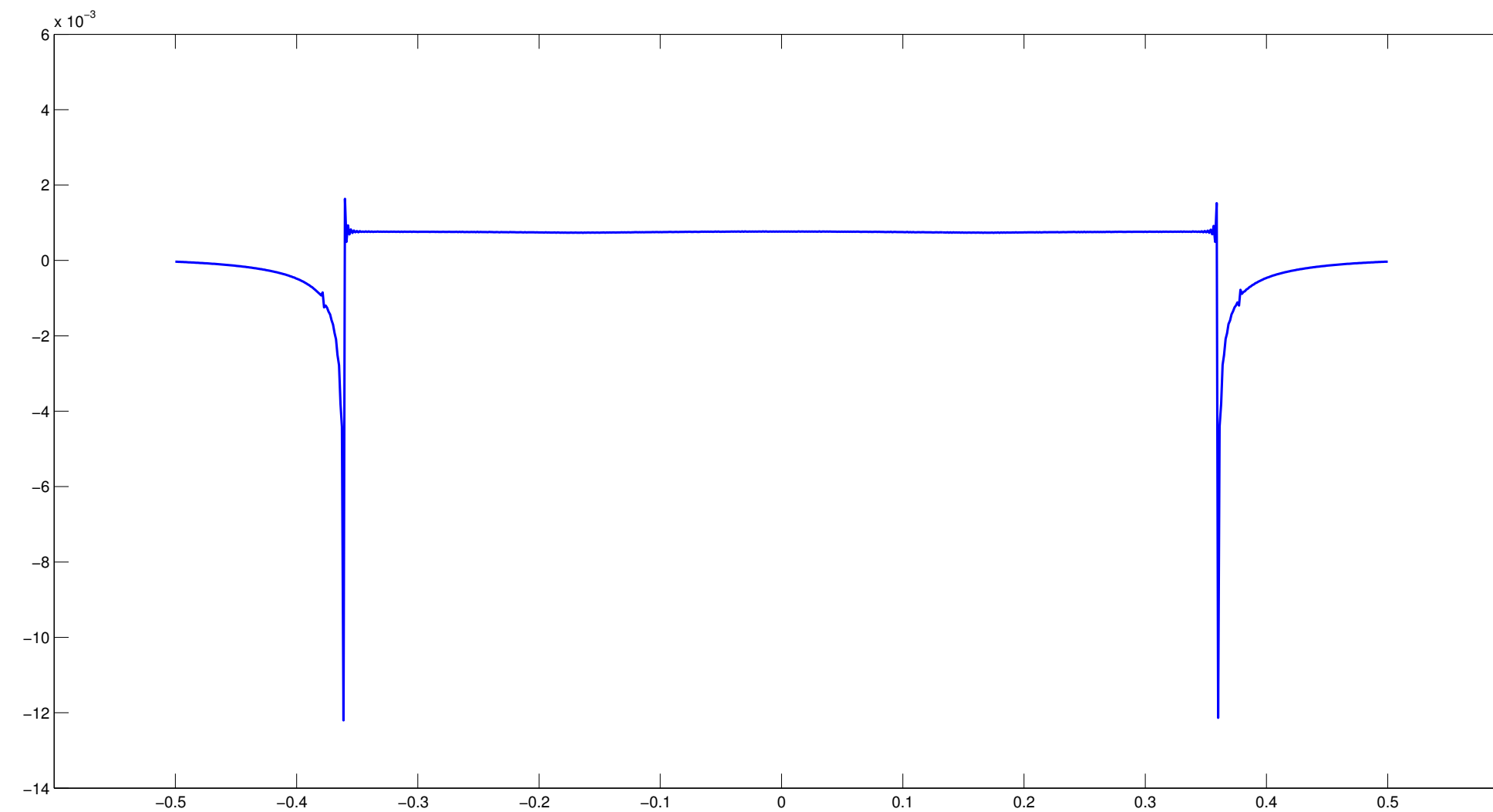


Figure 2: Filtered result of the noiseless projection

# Additive Noise (+2%): After Filtering

since center frequencz is killed and high frequencies are amplified

ramp filter

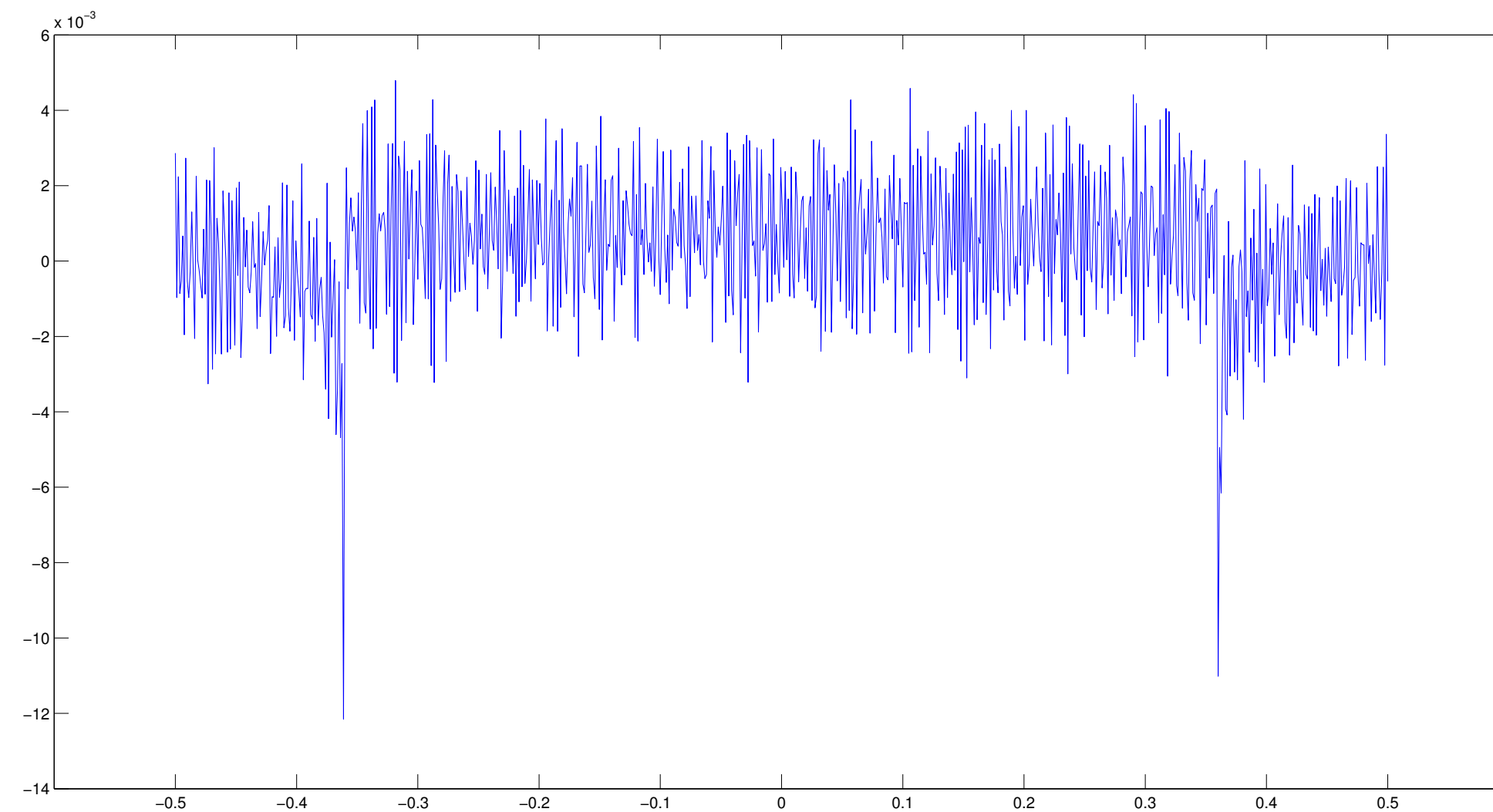


Figure 3: Filtered result of the noisy projection

# Noise ...

- ... is amplified when filtering with the ramp filter.
- ... has to be taken care of in an appropriate manner.
- ... is indirectly proportional to the applied dose.
- ... affects different reconstruction methods differently.

# Topics

## Effect of Noise on Filtering

## Window Functions good for removing noise (high frequency noise)

General Idea

Common Examples

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# Window Functions

Window functions are used to improve signals as high frequencies are reduced or even eliminated:

- Noise reduction
- Reduces high frequencies caused by cutting

Many window functions are known:

- Cosine window
- Shepp-Logan window
- ...



# Window Functions: Filter Adaptation

1. Apply the window function  $W$  in frequency domain:

$$P'(\omega, \theta) = W(\omega) \cdot P(\omega, \theta).$$

2. Then apply the filter  $H$ :

$$Q'(\omega, \theta) = H(\omega) \cdot P'(\omega, \theta) = \underset{\text{filter}}{H(\omega)} \cdot \underset{\text{window}}{W(\omega)} \cdot \underset{\text{beam?}}{P(\omega, \theta)}.$$

3. Rewrite the filtering equation to an adjusted filter  $H'$ :

$$Q'(\omega, \theta) = H'(\omega) \cdot P(\omega, \theta)$$

$$\Rightarrow \quad \underset{\text{filtering plus window}}{H'(\omega) = H(\omega) \cdot W(\omega)}.$$

# Rectangular Window (Frequency Cut-off)

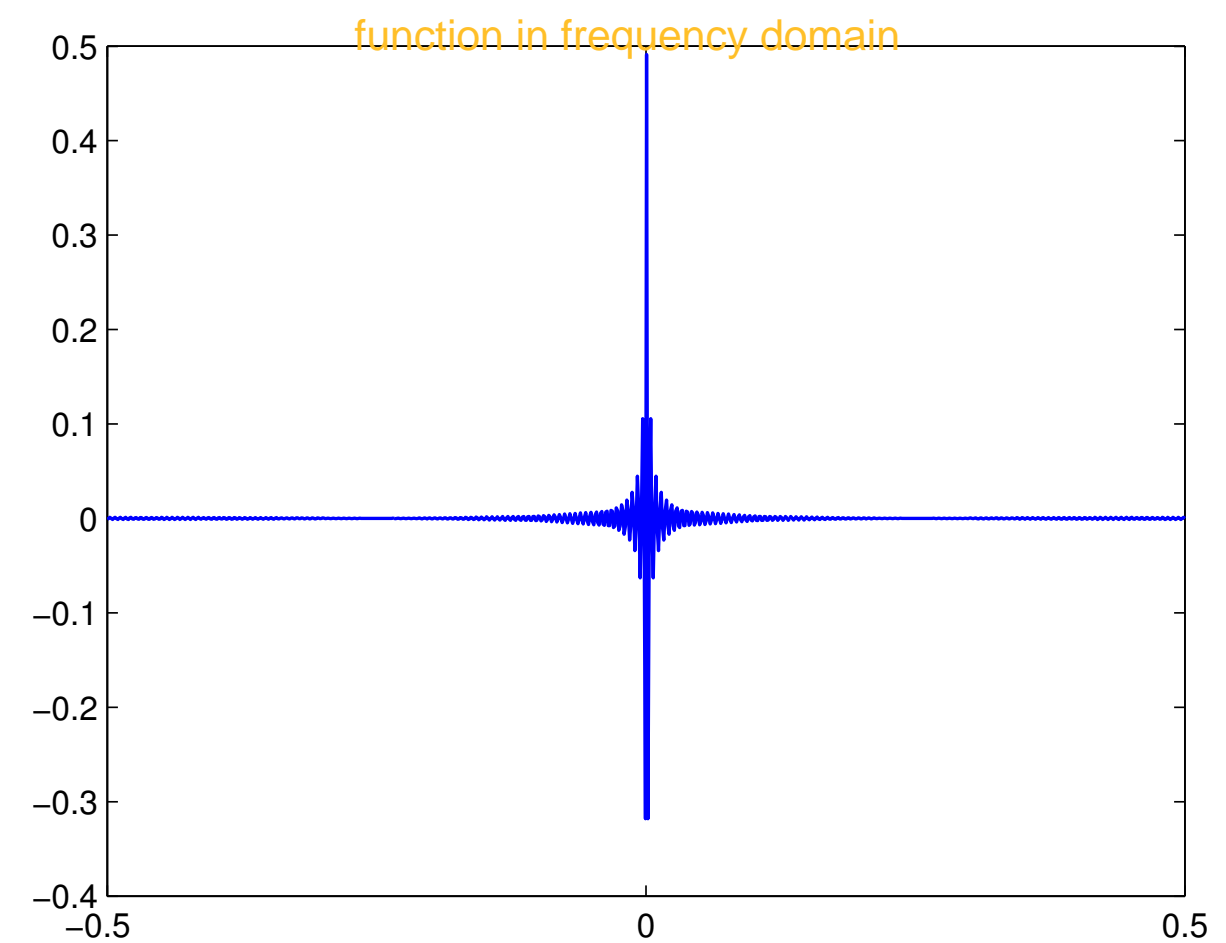
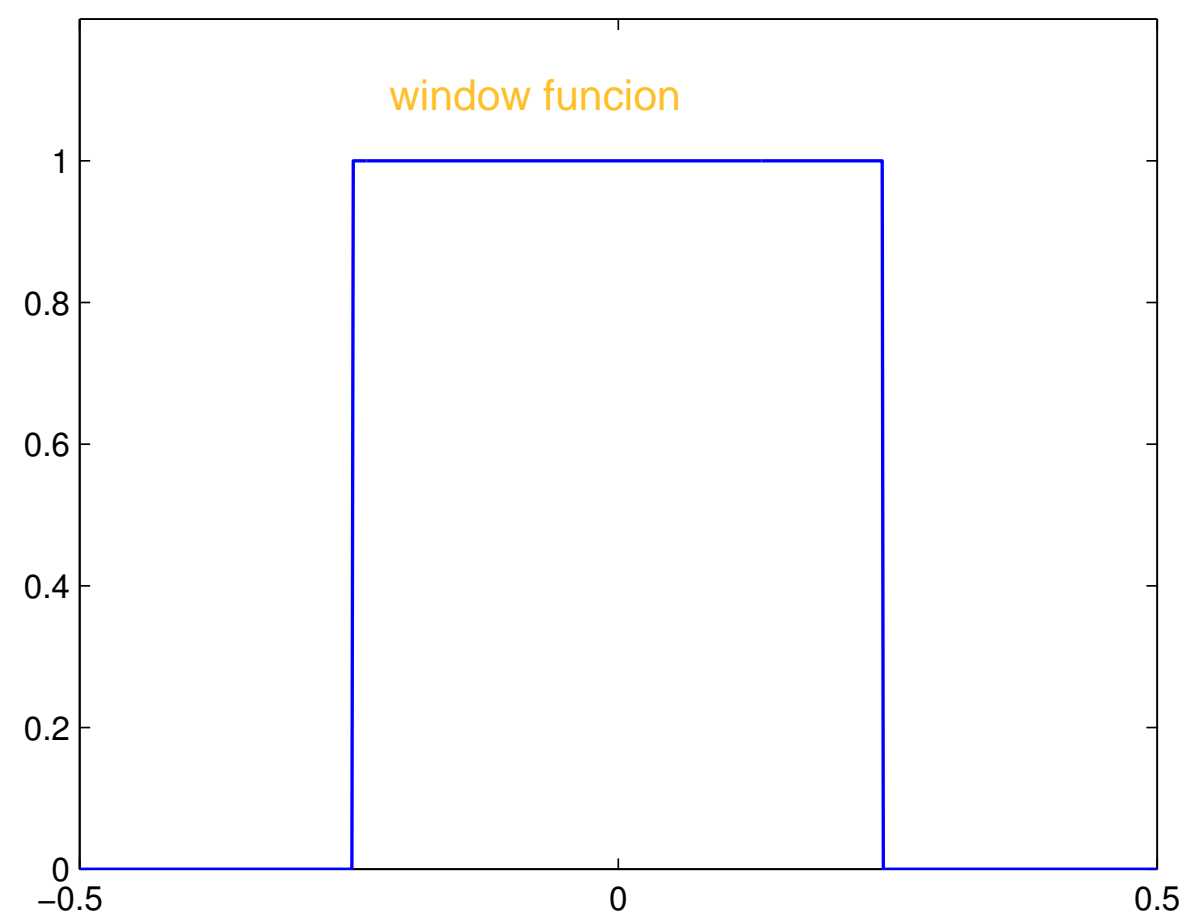


Figure 4: Rectangular window function in frequency domain (left) and its counterpart in spatial domain (right)

## Cosine Window: $\cos(\pi \cdot x)$

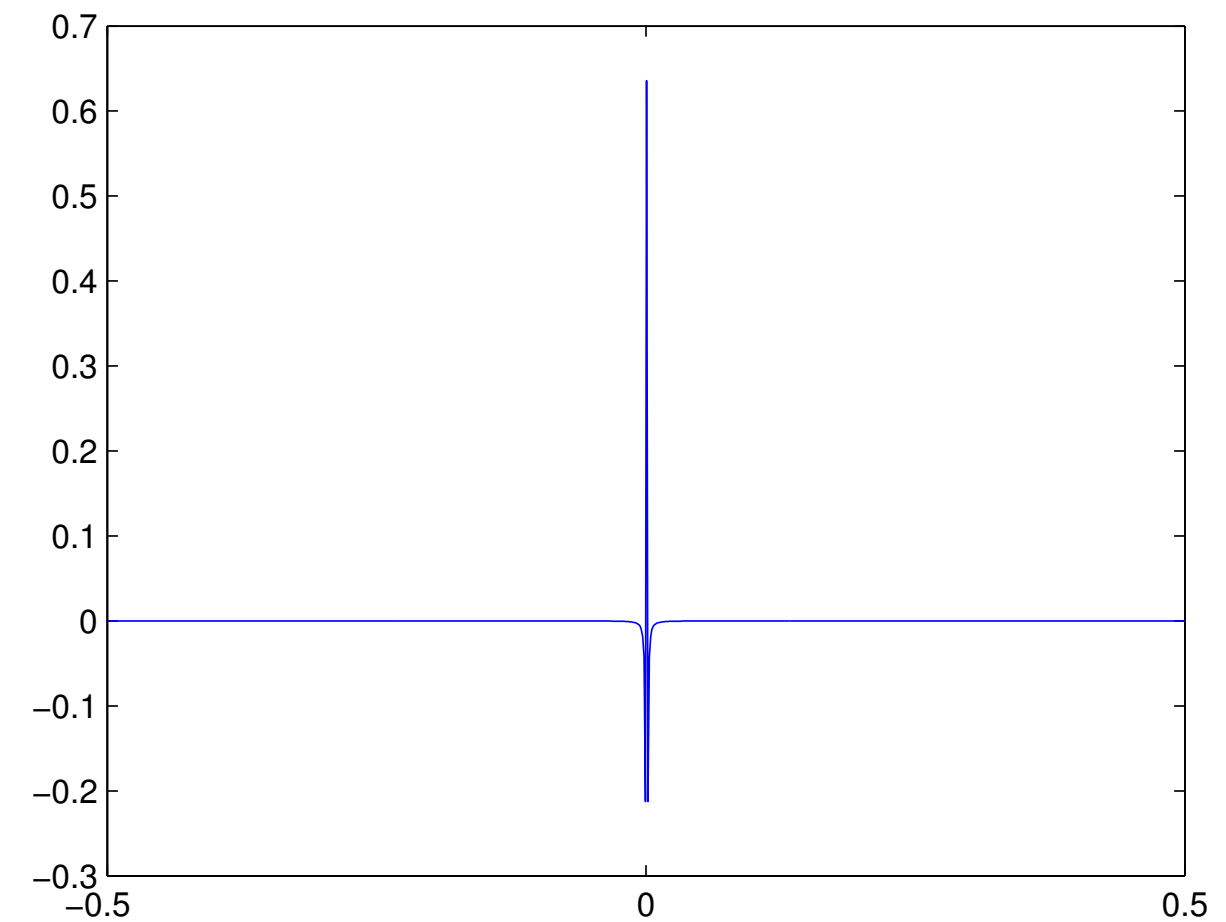
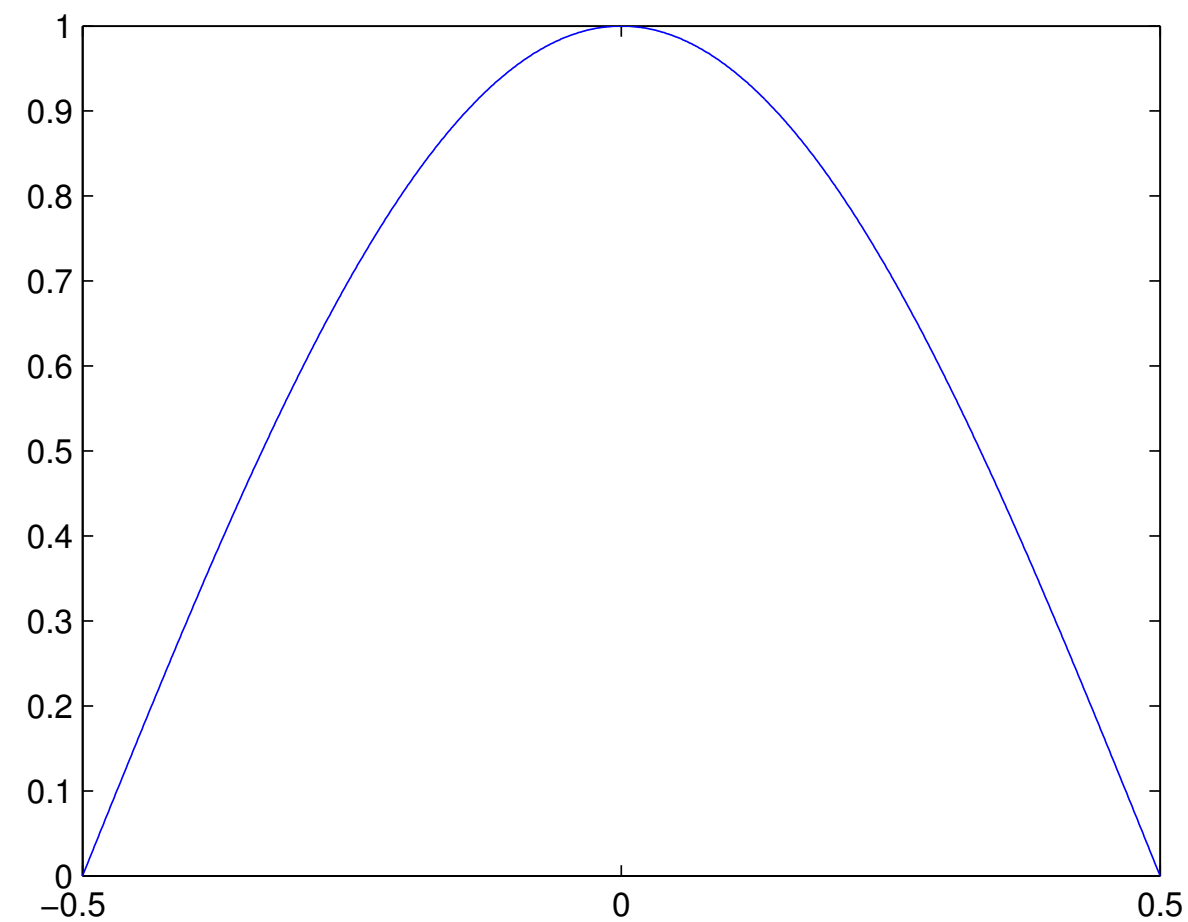


Figure 5: Cosine window function in frequency domain (left) and its counterpart in spatial domain (right)

# Shepp-Logan Window: $\frac{\sin(\pi \cdot x)}{(\pi \cdot x)}$

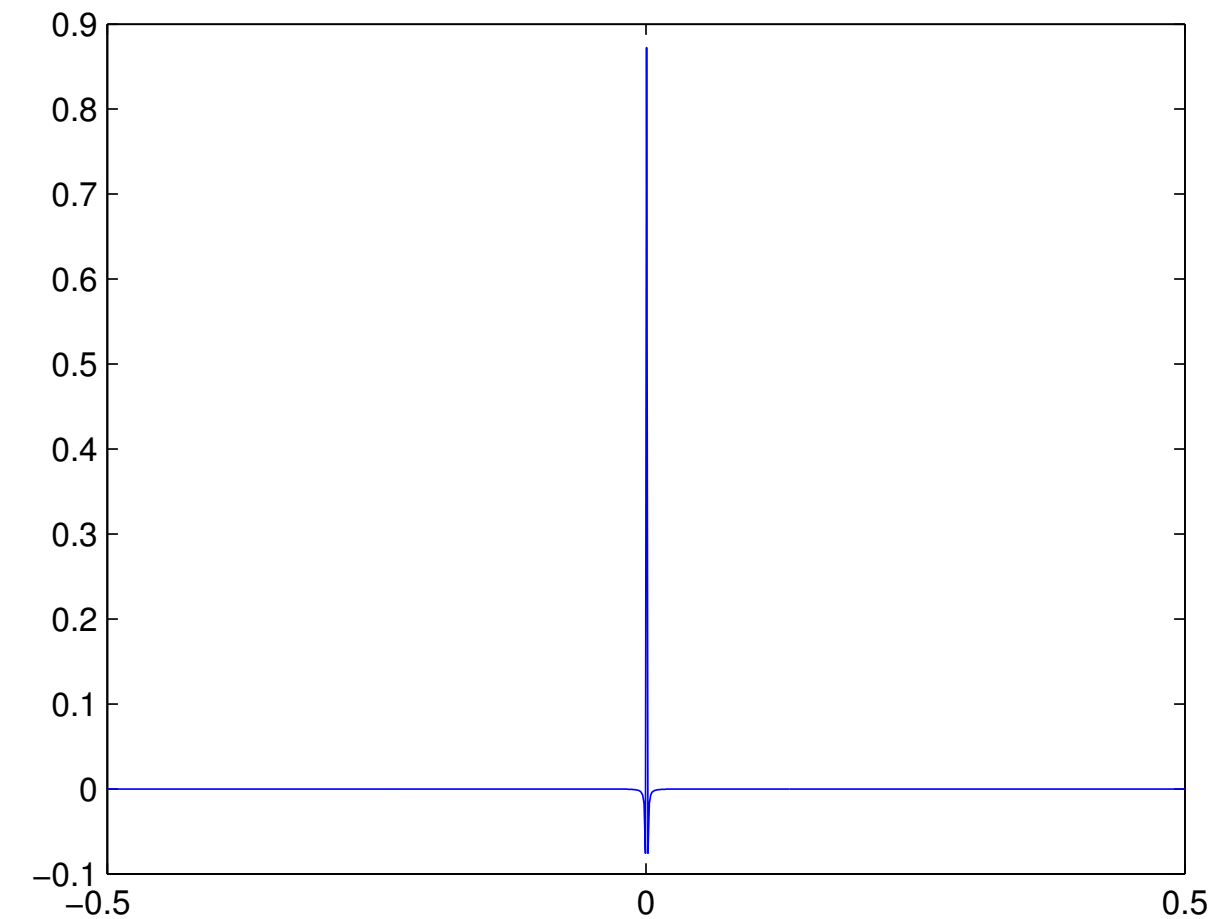


Figure 6: Shepp-Logan window function in frequency domain (left) and its counterpart in spatial domain (right)

# Rectangular Filter

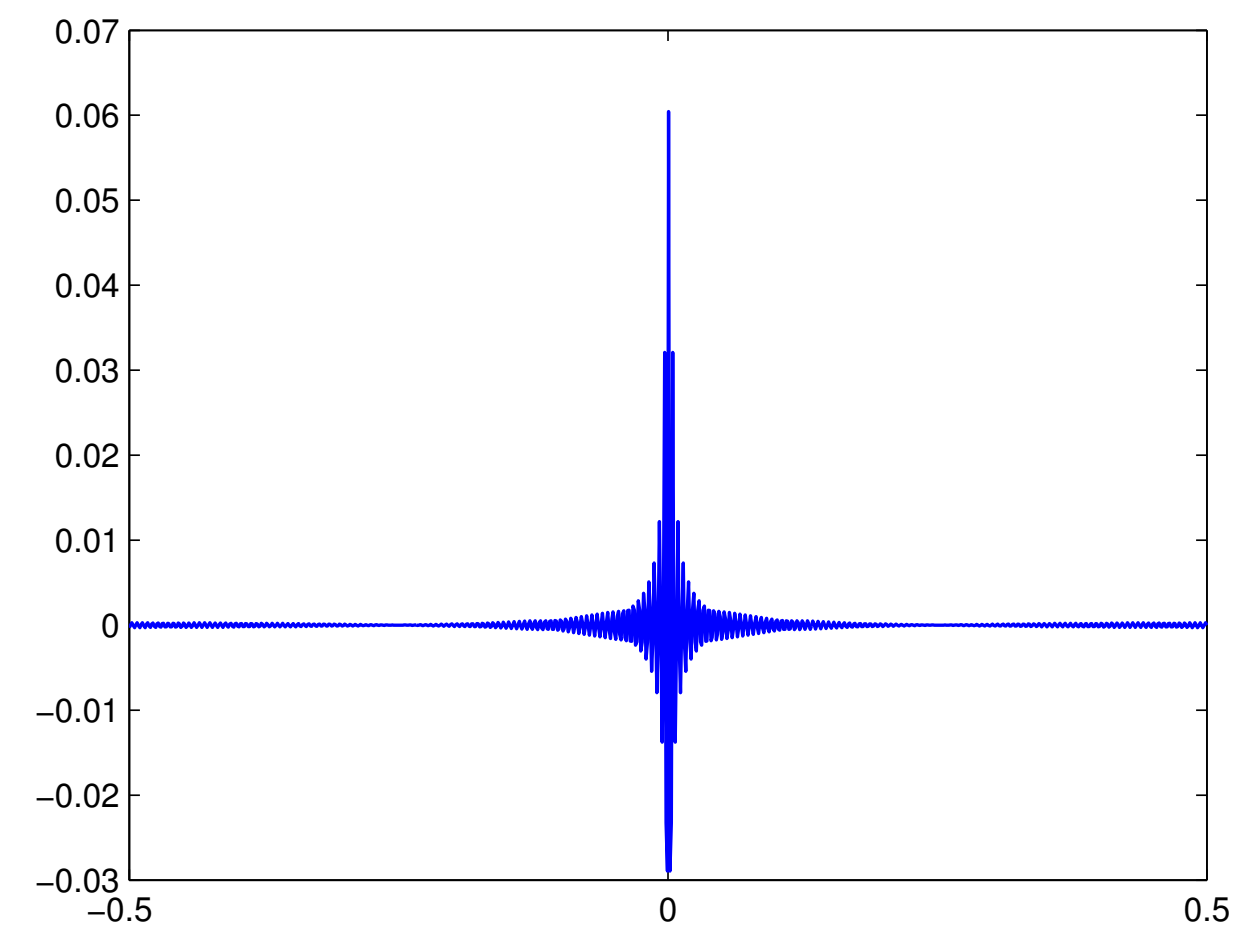
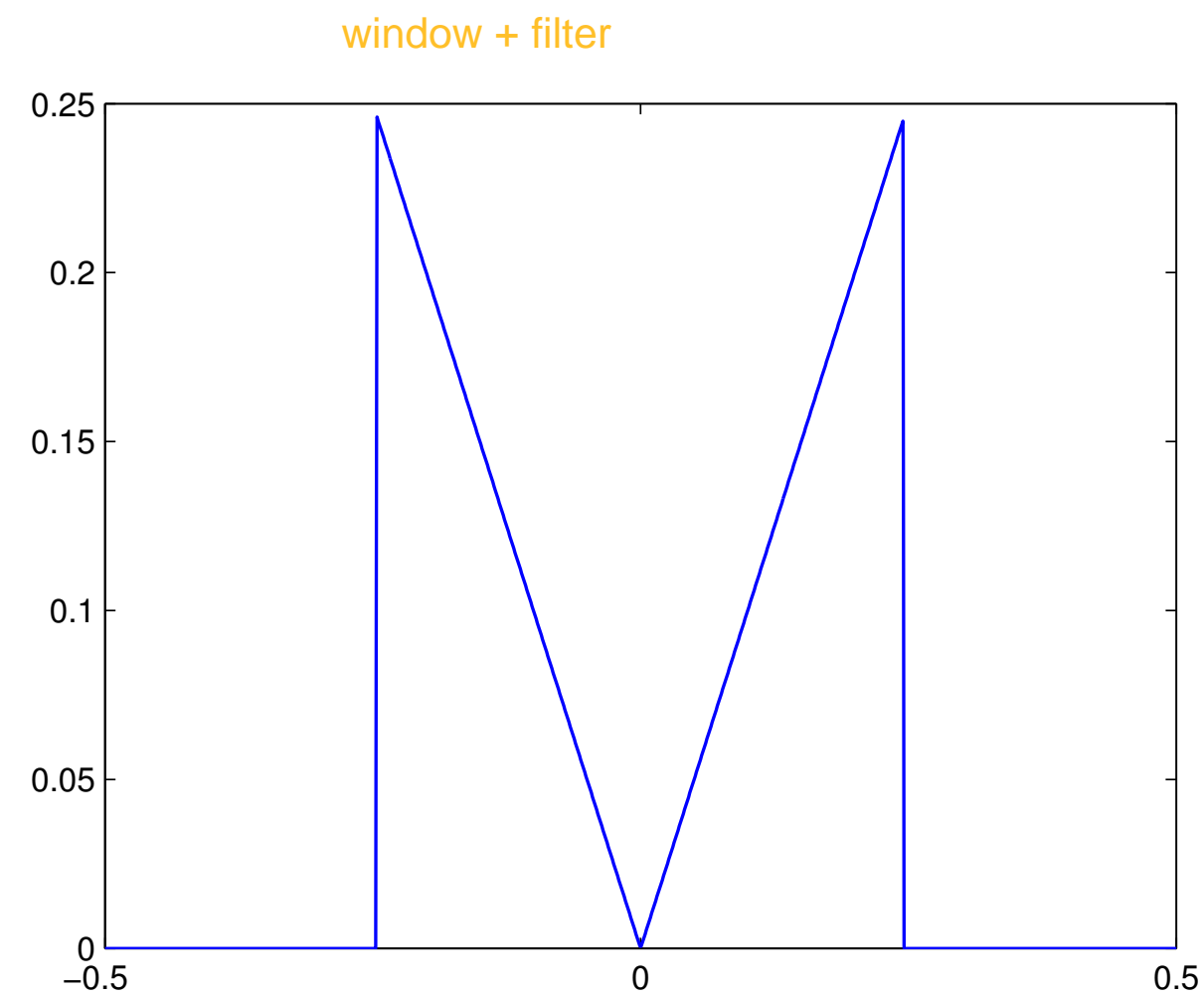


Figure 7: Rectangular filter in frequency domain (left) and its counterpart in spatial domain (right)

# Cosine Filter

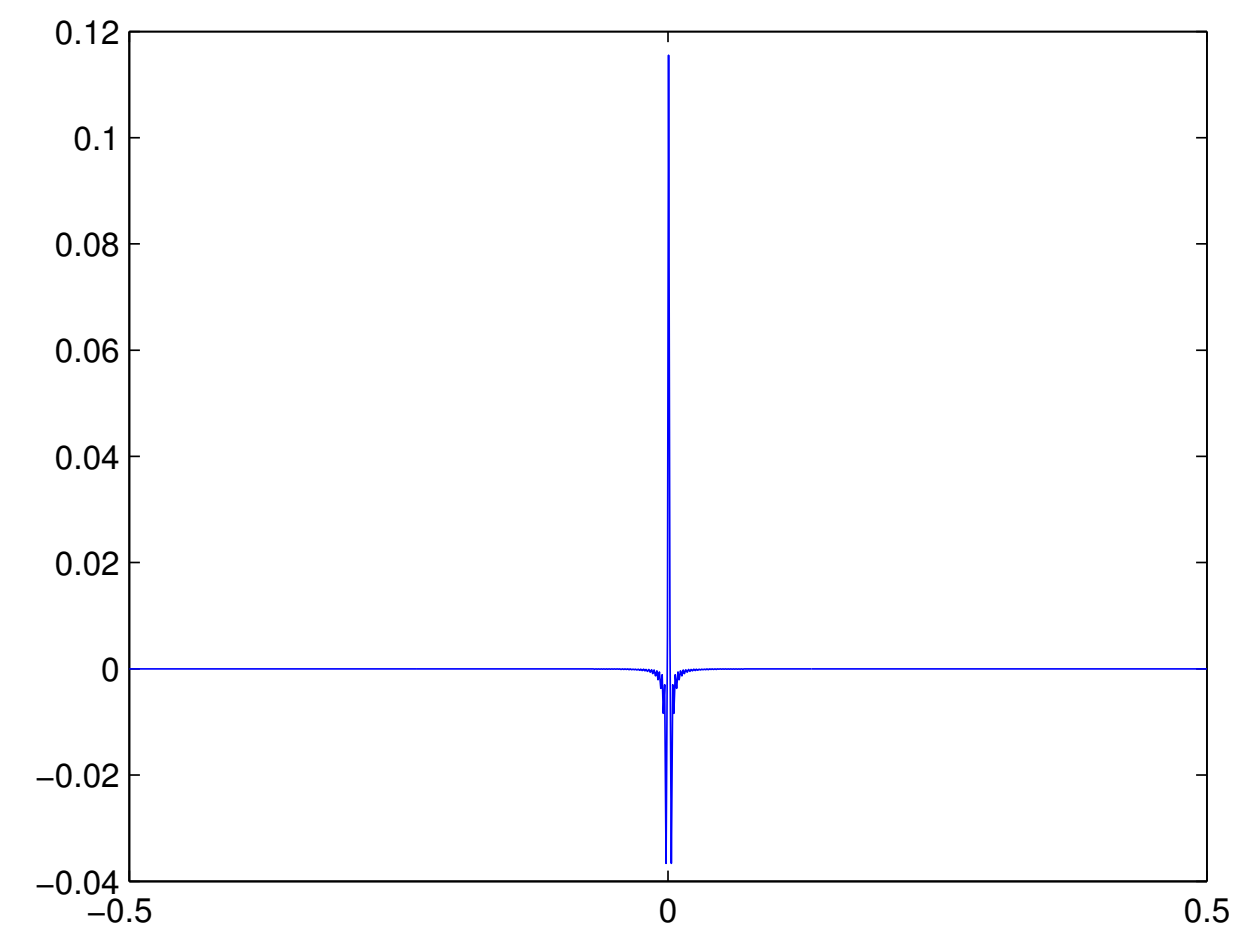
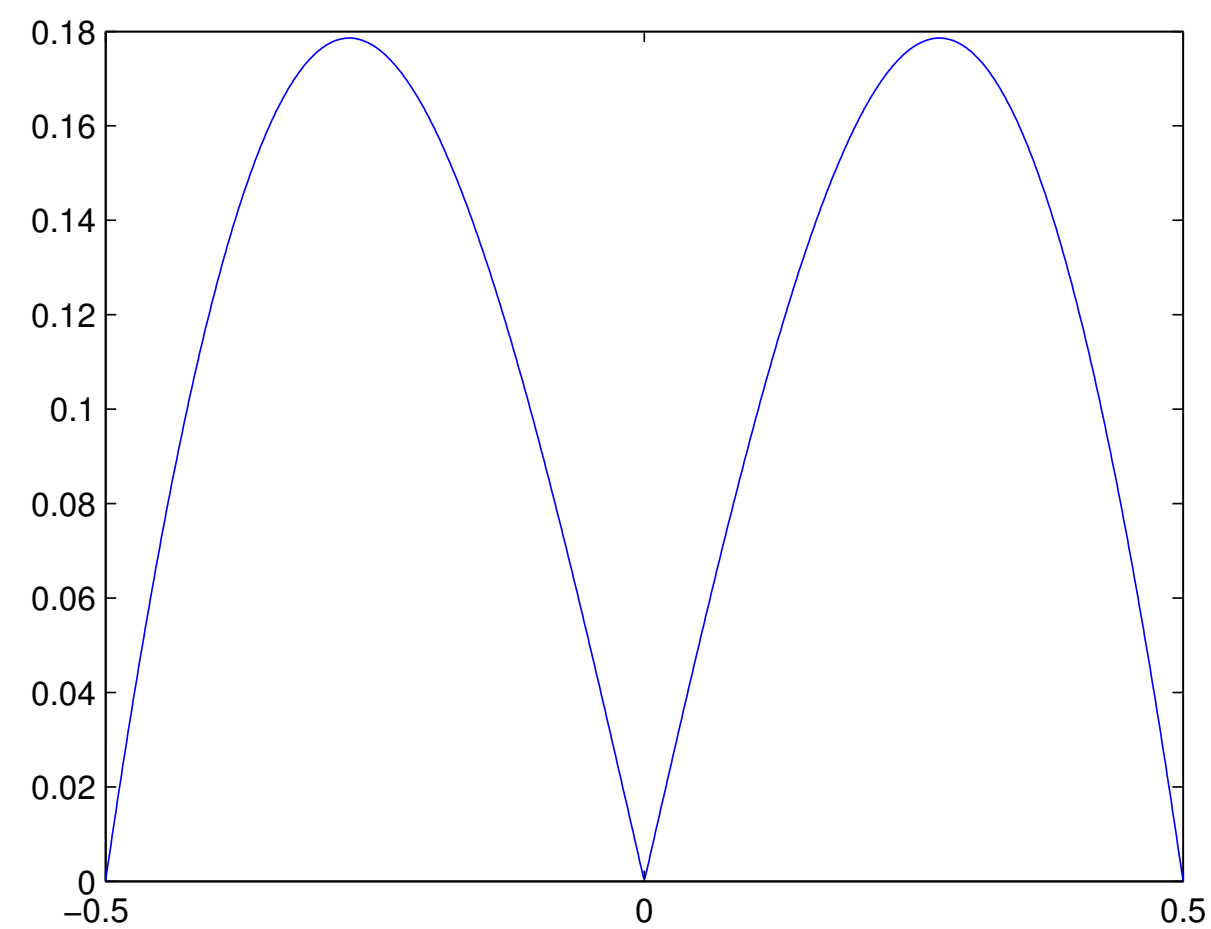


Figure 8: Cosine filter in frequency domain (left) and its counterpart in spatial domain (right)

# Shepp-Logan Filter

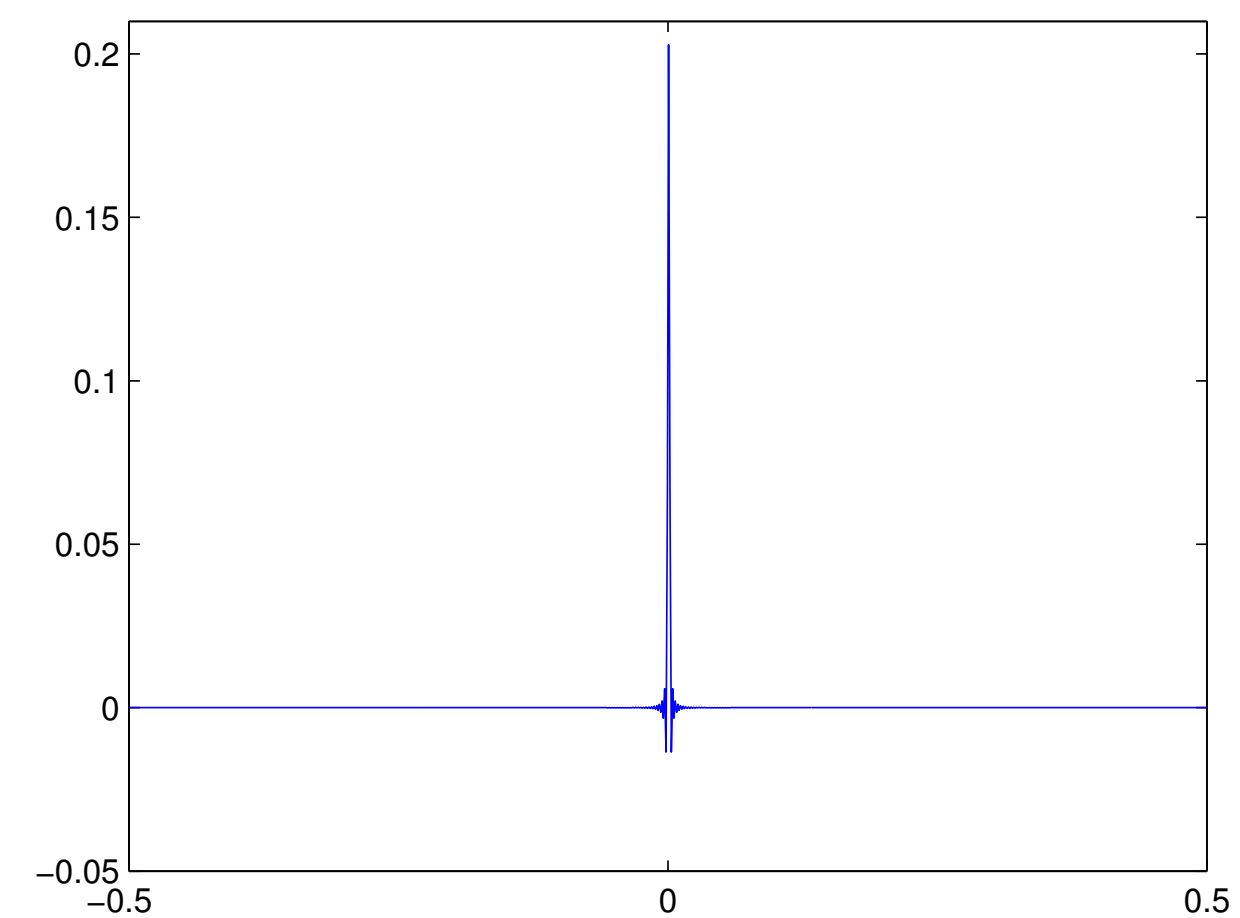
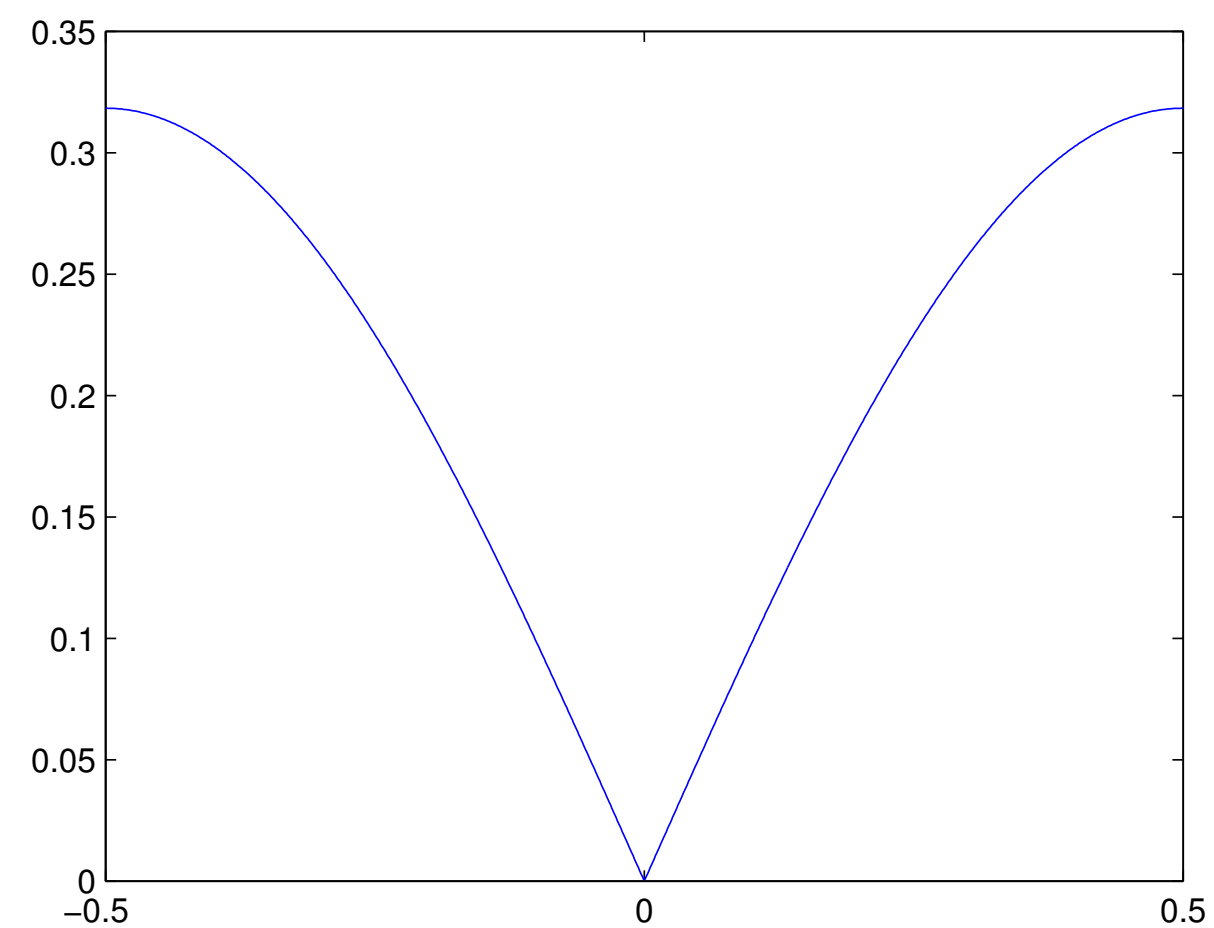


Figure 9: Shepp-Logan filter in frequency domain (left) and its counterpart in spatial domain (right)

# Ramp Filter Result

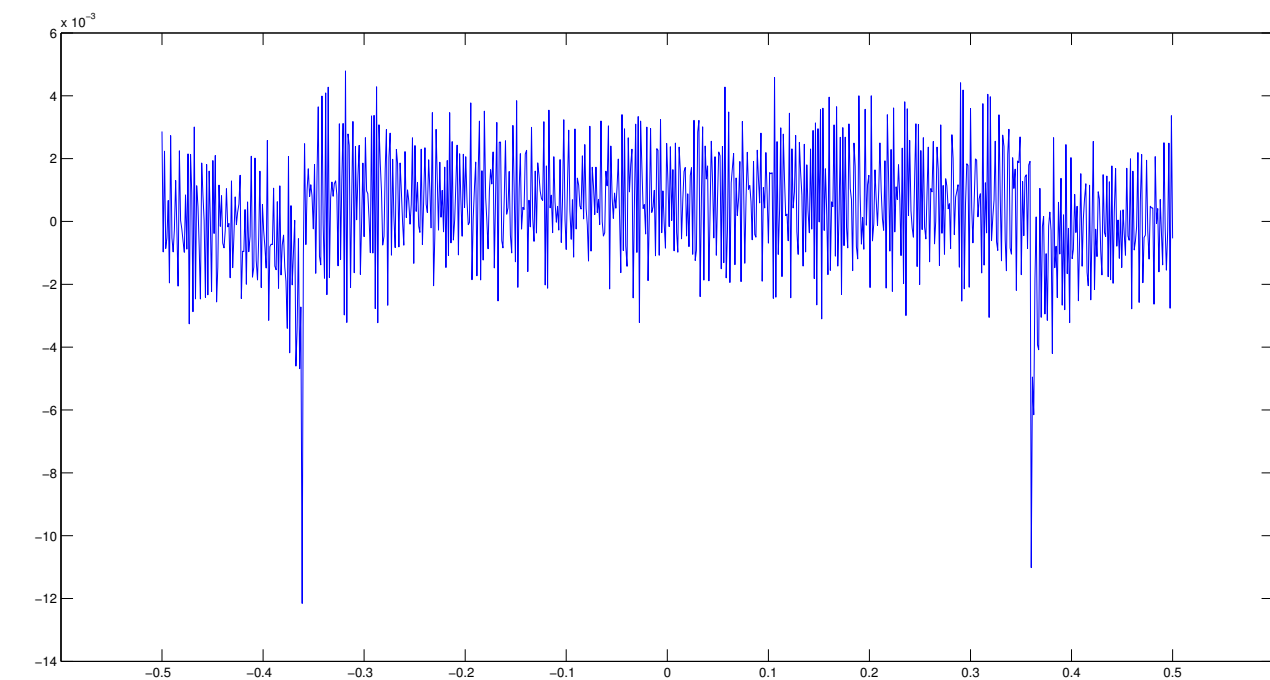
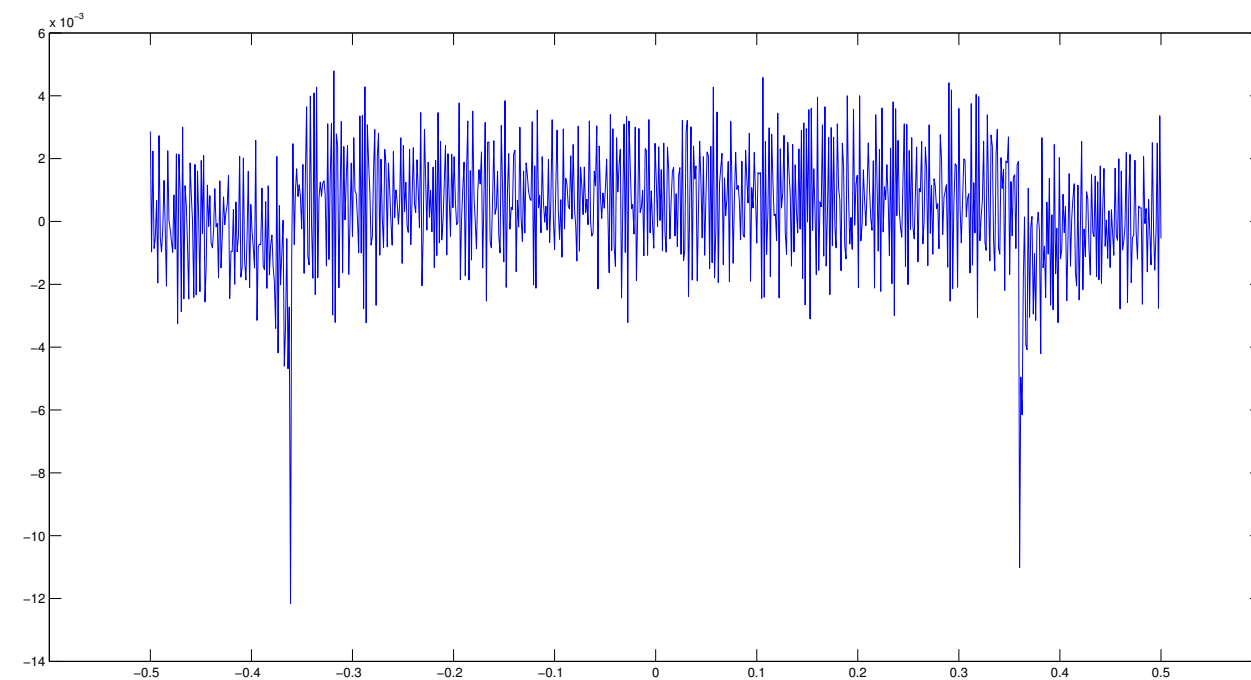


Figure 10: Filtered noisy projection using the rectangular window (left) vs. itself, the ramp filter (right)



# Cosine Filter Result

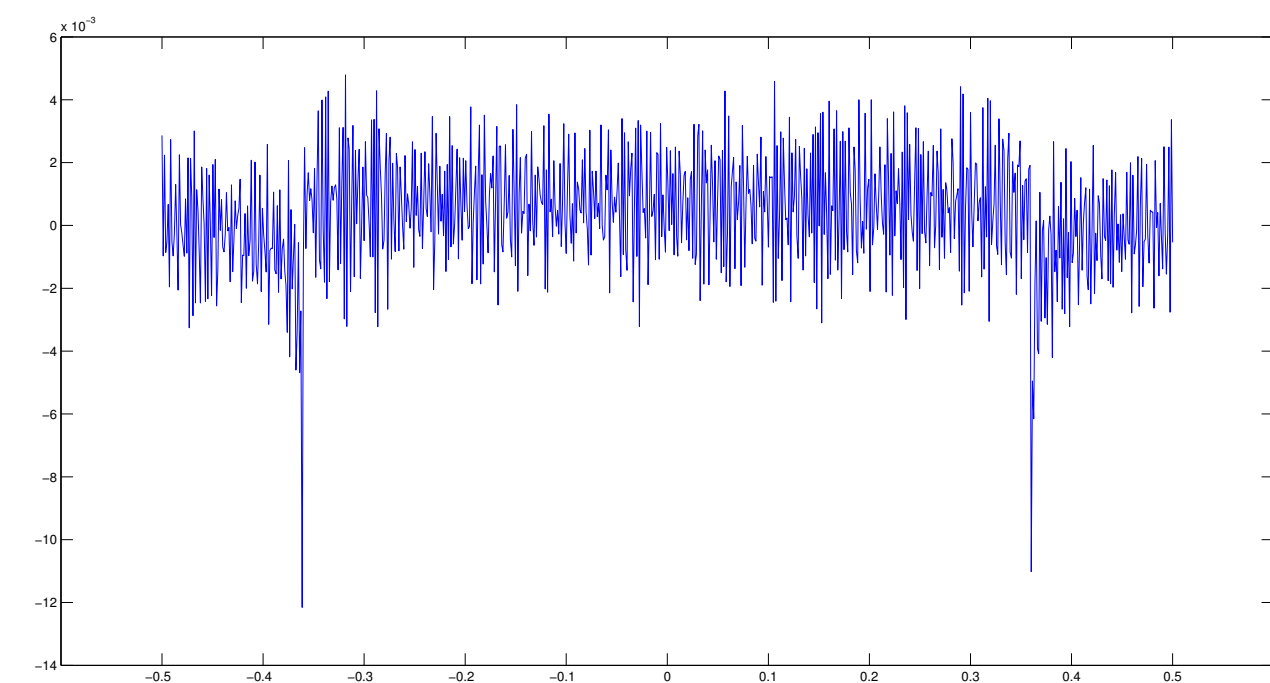
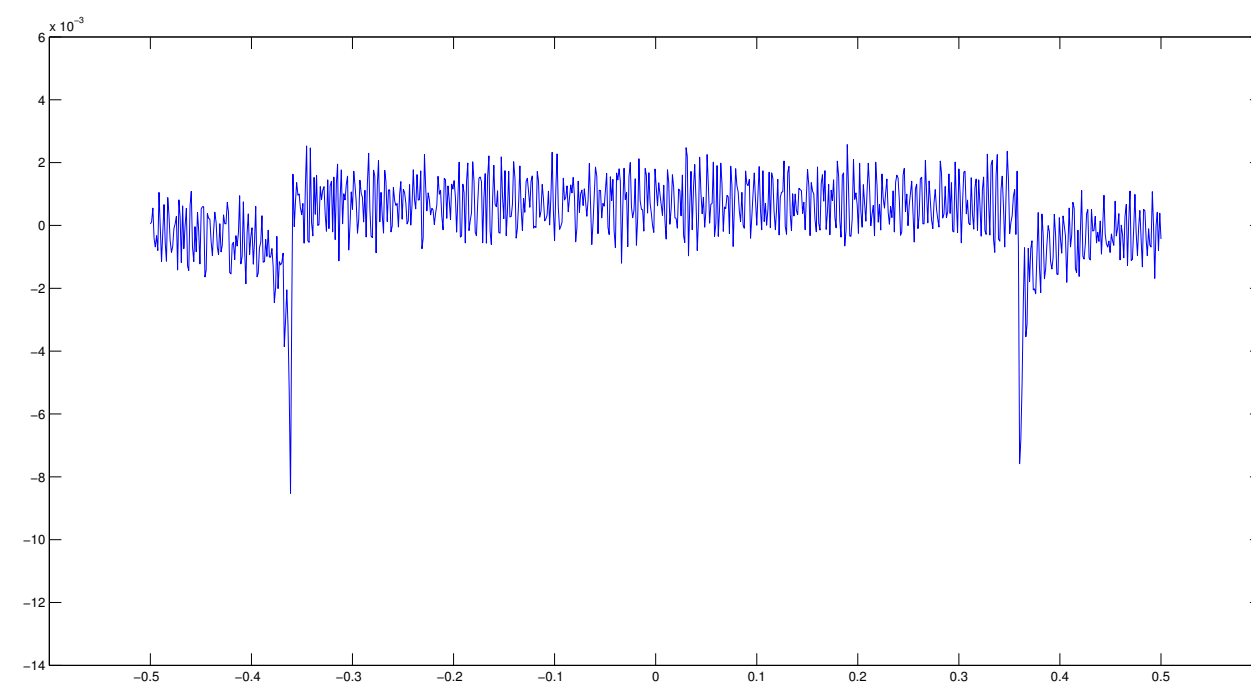


Figure 11: Filtered noisy projection using the cosine window (left) vs. the ramp filtered result (right)

# Shepp-Logan Filter Result

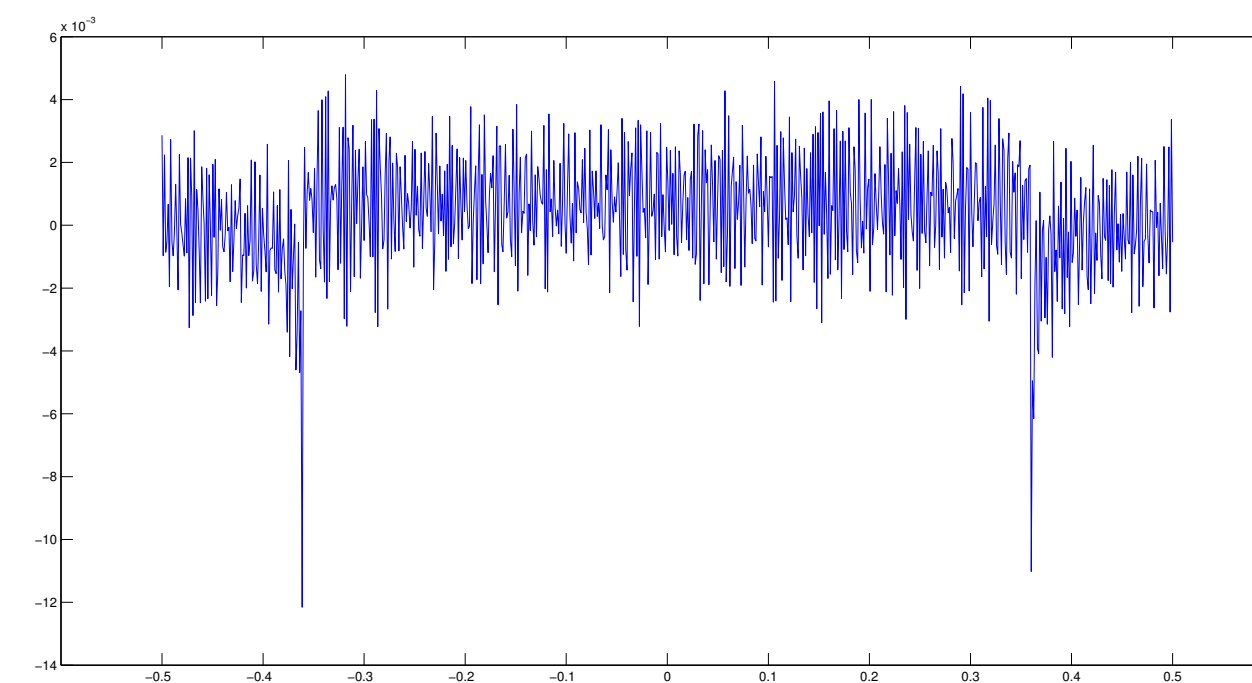
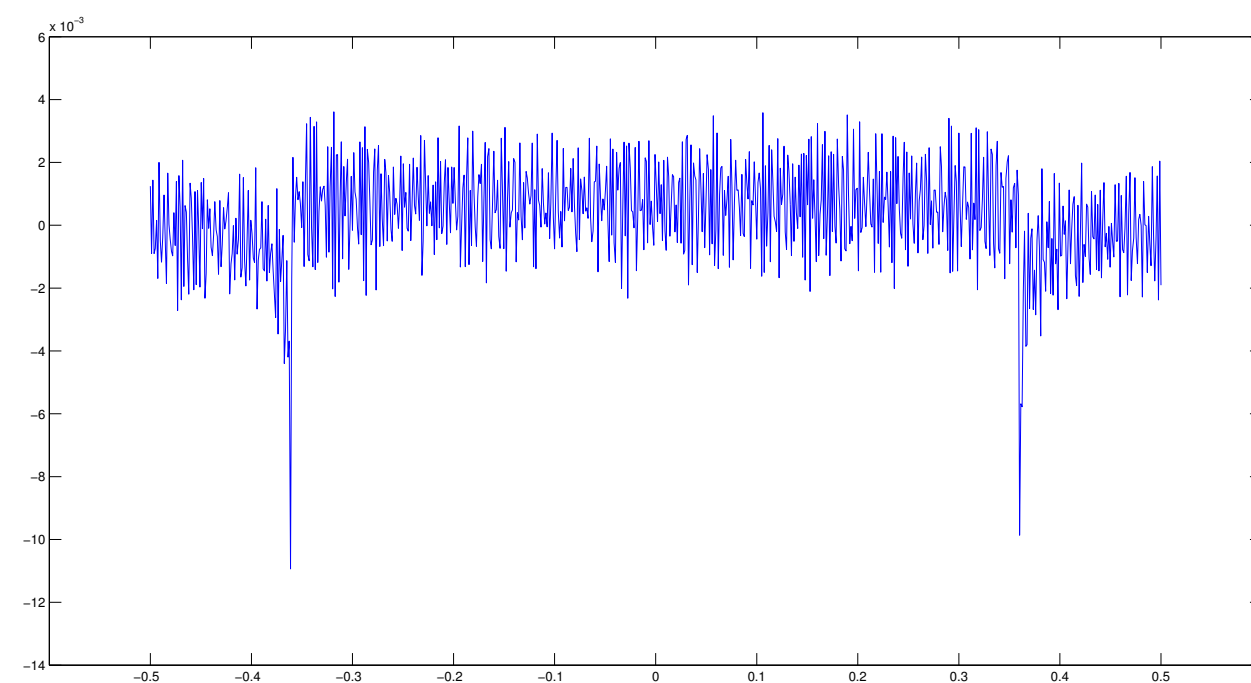


Figure 12: Filtered noisy projection using the Shepp-Logan window (left) vs. the ramp filtered result (right)

# Topics

Effect of Noise on Filtering

Window Functions

- General Idea

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## Summary

- Take Home Messages

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# Take Home Messages

- Noise has a severe effect on the filtering result.
- Window functions can be used to reduce this effect.
- We have learned about the frequency cut-off, the cosine window and the Shepp-Logan window.

## Further Readings

The original Ram-Lak article is:

G. N. Ramachandran and A. V. Lakshminarayanan. “Three-dimensional Reconstruction from Radiographs and Electron Micrographs: Application of Convolutions instead of Fourier Transforms”. In: *Proceedings of the National Academy of Sciences of the United States of America* 68.9 (Sept. 1971), pp. 2236–2240

The concise reconstruction book from ‘Larry’ Zeng:

Gengsheng Lawrence Zeng. *Medical Image Reconstruction – A Conceptual Tutorial*. Springer-Verlag Berlin Heidelberg, 2010. DOI: 10.1007/978-3-642-05368-9

Another mathematical examination of filtered backprojection can be found in

Thorsten Buzug. *Computed Tomography: From Photon Statistics to Modern Cone-Beam CT*. Springer Berlin Heidelberg, 2008. DOI: 10.1007/978-3-540-39408-2