

# Physics Coding Club

More Fast Fourier Transforms

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# Fourier Series

Recall: Any 'sensible' 1D periodic function with period  $L$  may be expressed as a Fourier series:

$$f(x) = \sum_{G=-\infty}^{\infty} c_G e^{\frac{2\pi i G x}{L}}$$

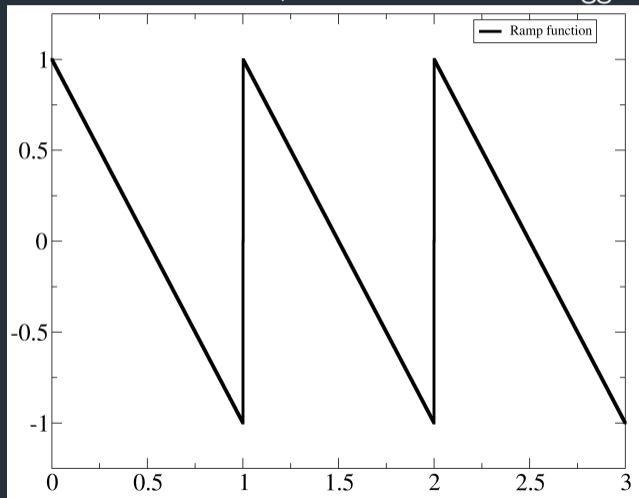
where  $i$  is the imaginary number,  $G$  is an integer and  $c_G$  are complex coefficients.

Note:

- Fourier series are continuous everywhere
- Derivatives of Fourier series are also Fourier series
  - Derivatives are continuous everywhere
  - Fourier series are differentiable everywhere

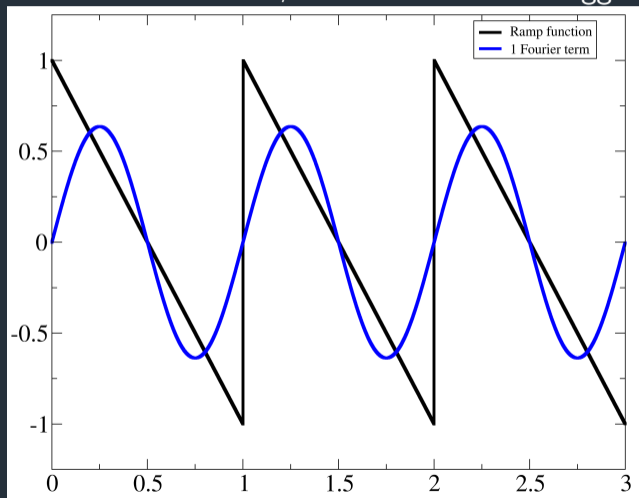
# Gibbs overshoot

Where a function is not differentiable, the Fourier series struggles to match it.



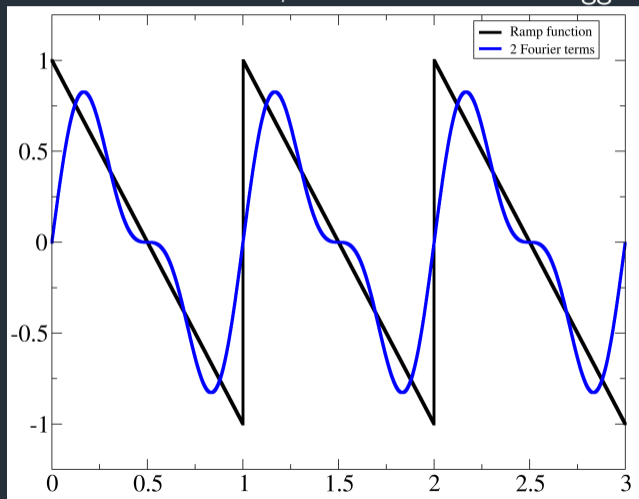
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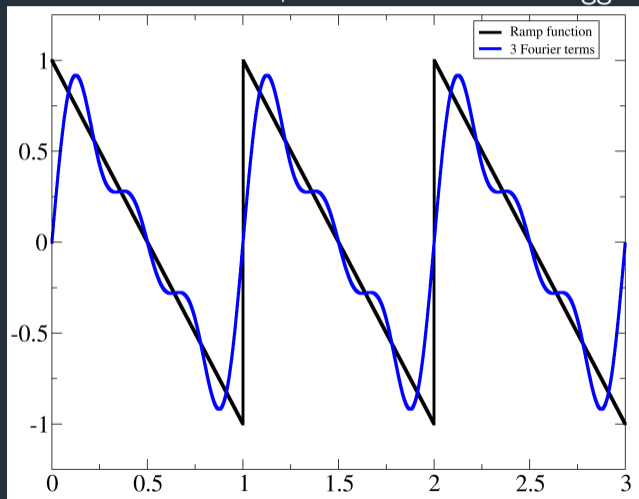
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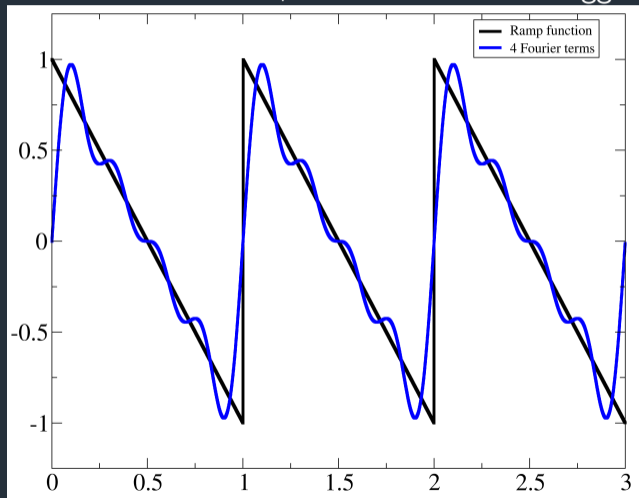
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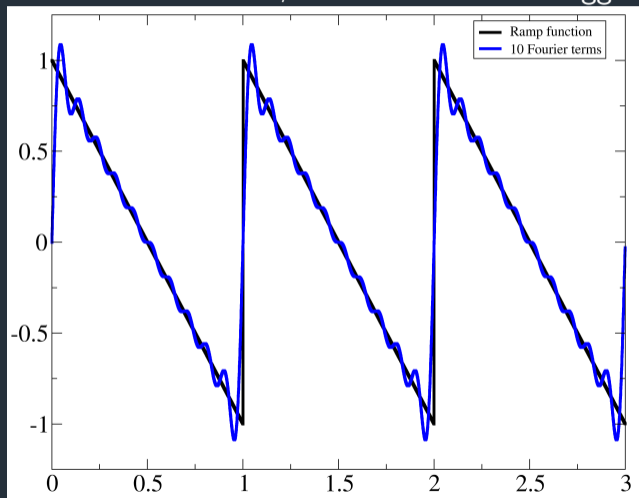
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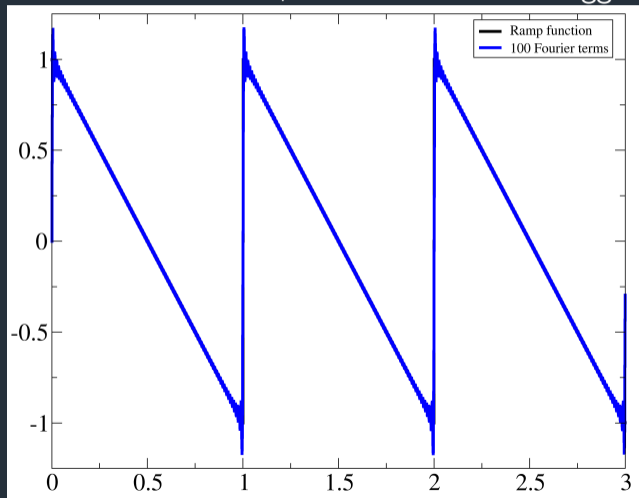
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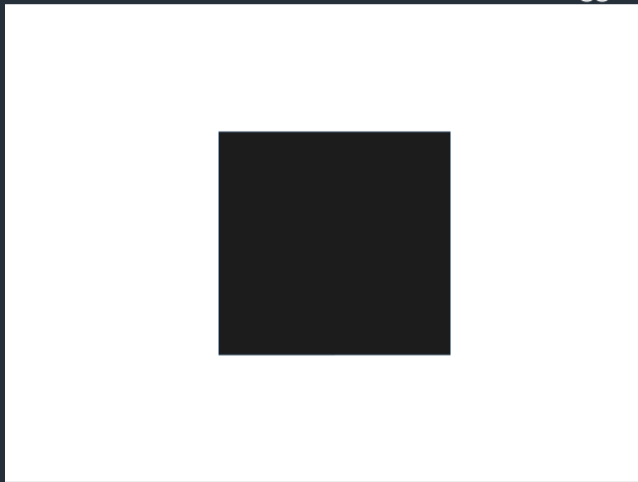
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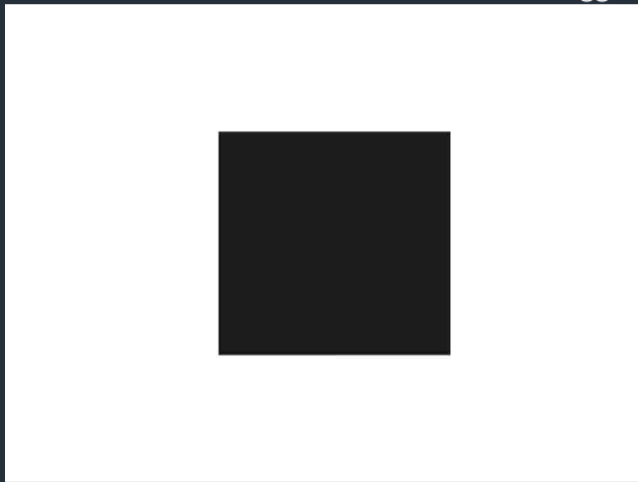
# Square 100

Where a function is not differentiable, the Fourier series struggles to match it.



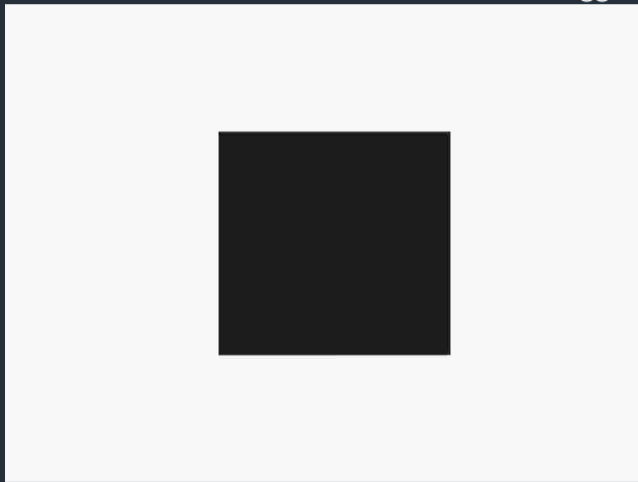
# Square 10

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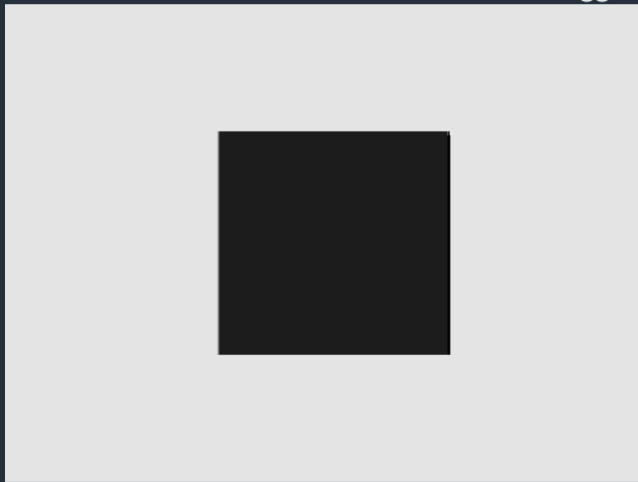
# Square 5

Where a function is not differentiable, the Fourier series struggles to match it.



# Square 1

Where a function is not differentiable, the Fourier series struggles to match it.



# Squares

Where a function is not differentiable, the Fourier series struggles to match it.



# 3D

Any 3D periodic function may be expressed as a Fourier series:

$$f(\mathbf{r}) = \sum_{n=-\infty}^{\infty} c_n e^{i\mathbf{G}_n \cdot \mathbf{r}}$$

where  $c_n$  are (usually) complex and  $\mathbf{G}_n$  are the Fourier wavevectors.

A 3D FFT may be performed as 3 separate sets of 1D FFTs, e.g. transforming the entire data in  $z$ , then  $y$  and then  $x$ .

# Beyond the FFT

- Parallel FFT
- Non-uniform FFT
- Fractional FFT
- FFT with derivative information?

We'll only look at the first two here.



# Parallel FFT

- Each core only has some of the Fourier components
- Each core only has some of the real-space points
- Fourier transform: *all* Fourier components contribute at *all* points in real-space.

# Fourier component parallelism

- 3D transform can be performed as 3 1D transforms
- Give each core all Fourier components in a column in  $z$
- Each core does transform in  $z$
- All cores swap data so they have  $y$ -column data
- Each core does transform in  $y$
- All cores swap data so they have  $x$ -column data
- Each core does transform in  $x$ 
  - Each core ends up with real-space data in  $x$

# 3D FFT in parallel

- Actual (1D) transforms distribute well
- Transpositions are a problem
- Every core has to communicate with every other core!
  - as  $N_{core}$  increases, Fourier transform will dominate.
  - when the communication time is comparable to the compute time, there's no point using more cores.

# Parallel bottlenecks

- Ultimate scaling dominated by all-to-all communications
- Number of messages increases as  $N_{cores}^2$
- Size of messages decreases as  $\frac{1}{N_{cores}^2}$
- Particularly problematic because of limited NICs/node

# Non-uniform DFTs

What if we don't sample with a regular grid?

Broadly classified as 3 types of non-uniform Fourier transform (NUFT):

- 1 Space sampled uniformly, but want non-uniform frequencies
- 2 Space sampled non-uniformly, but want uniform frequencies
- 3 Space sampled non-uniformly, want non-uniform frequencies

Because the Fourier transform and inverse Fourier transform are closely related (via complex conjugates), Types 1 and 2 are closely related.

# Non-uniform DFTs

Like ordinary DFTs, the obvious way to do an  $N$ -point NUFT scales as  $N^2$ . There are many ways people try to do NUFTs in a fast way – NUFFTs – but they almost all end up being ways to map the non-uniform problem onto a uniform one (or a set of uniform ones), and using a standard FFT:

- Oversampling + interpolation

E.g. fit splines to the non-uniform regions and sample onto uniform grid

- Approximate (low-rank) transforms

These are quick to apply but only approximate the NUFT. The accuracy of the method depends on the rank of the approximation, so it is controllable.

[http://homepages.inf.ed.ac.uk/rbf/CVonline/LOCAL\\_COPIES/PIRODDI1/NUFT/NUFT.html](http://homepages.inf.ed.ac.uk/rbf/CVonline/LOCAL_COPIES/PIRODDI1/NUFT/NUFT.html)

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