# Implicitly Dealiased Convolutions for Distributed Memory Architectures

Malcolm Roberts\*,1, John C. Bowman<sup>2</sup>

<sup>1</sup>University of Strasbourg <sup>2</sup>University of Alberta

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<sup>\*</sup>malcolm.i.w.roberts@gmail.com, www.malcolmiwroberts.com

#### **Abstract**

# Implicitly Dealiased Convolutions for Distributed Memory Architectures

Convolutions are a fundamental tool of scientific computing. For multi-dimensional data, implicitly dealiased convolutions [Bowman and Roberts, SIAM J. Sci. Comput. 2011] are faster and require less memory than conventional FFT-based methods. We present a hybrid OpenMP/MPI implementation in the open-source software library FFTW++. The reduced memory footprint translates to a reduced communication cost, and the separation of input and work arrays allows one to overlap computation and communication.

#### Outline

- Dealiasing FFT-based convolutions
  - ► Conventional zero-padding
  - ► Implicit zero-padding
- ► Hybrid OpenMP/MPI parallelism
- ▶ 1/2 padded convolutions
  - Performance results
- ▶ 2/3 padded convolutions for pseudospectral simulations
  - ► The Nyquist frequency: compact vs. non-compact
  - Performance results

#### Computing convolutions using FFTs

The convolution of F and G of length m is

$$(F \star G)_k = \sum_{\ell=0}^{k-1} F_{\ell} G_{k-\ell}.$$
 (1)

Using FFTs improves speed and accuracy.

However, the indices are equivalent module m.

To recover a linear convolution, we must remove the aliased terms.

#### Dealiasing with conventional zero-padding

Conventionally, one pads the input with zeros:

$$\widetilde{F} \doteq \{F_0, F_1, \dots, F_{m-2}, F_{m-1}, \underbrace{0, \dots, 0}_{m}\}$$
 (2)

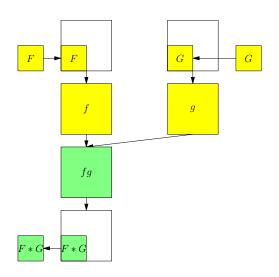
So that

$$\left(\widetilde{F} *_{2N} \widetilde{G}\right)_{k} = \sum_{\ell=0}^{2N-1} \widetilde{F}_{\ell \mod 2N} \widetilde{G}_{(k-\ell) \mod 2N}$$

$$= \sum_{\ell=0}^{N-1} F_{\ell} \widetilde{G}_{(k-\ell) \mod 2N}$$

$$= \sum_{\ell=0}^{k} F_{\ell} G_{k-\ell}.$$
(3)

## Dealiasing with conventional zero-padding



Malcolm Roberts

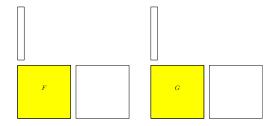
malcolmiwroberts.com

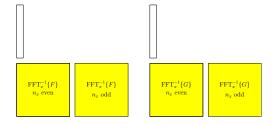
We modify the FFT to account for the zeros implicitly. Let  $\zeta_n = \exp(-i2\pi/n)$ . The Fourier transform of  $\widetilde{F}$  is

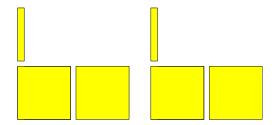
$$f_{x} = \sum_{k=0}^{2m-1} \zeta_{2m}^{xk} \widetilde{F}_{k}, \quad x = 0, \dots, 2m-1$$
 (4)

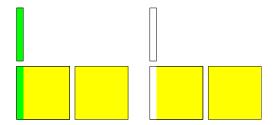
We can compute this using two discontiguous buffers of length *m*:

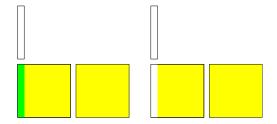
$$f_{2x} = \sum_{k=0}^{m-1} \zeta_m^{xk} F_k \quad f_{2x+1} = \sum_{k=0}^{m-1} \zeta_m^{xk} \left( \zeta_{2m}^k F_k \right). \tag{5}$$

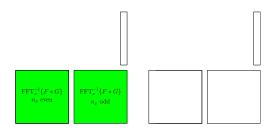


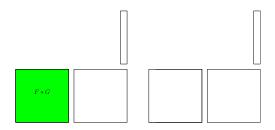








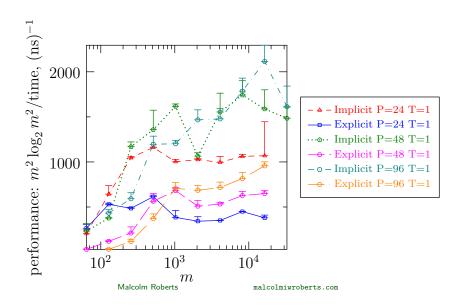




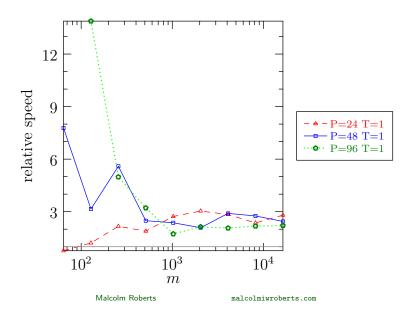
#### OpenMP/MPI implementation

- Implicitly dealiased convolutions require less communication.
- ▶ By using discontiguous buffers, we can overlap communication and computation.
- ► We use a hybrid OpenMP/MPI parallelization for clusters of multi-core machines.
- ▶ 2D MPI data decomposition.
- SSE2 vectorization instructions.
- ▶ We make use of the *hybrid transpose* algorithm (see CP13 today at 15:20).

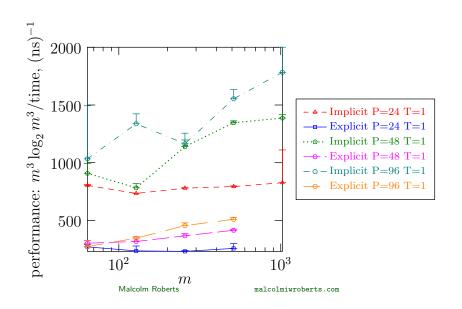
#### 1/2 padding: 2D performance



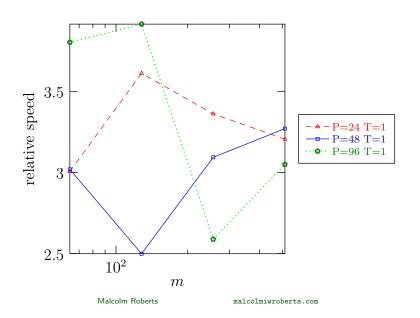
#### 1/2 padding: 2D performance



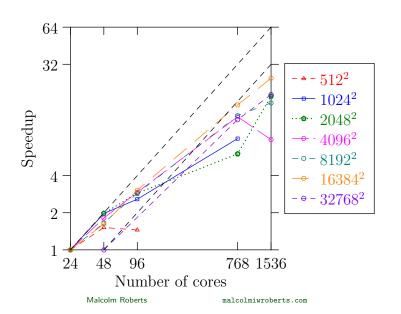
#### 1/2 padding: 3D performance



## 1/2 padding: 3D performance



## 1/2 padding: 3D scaling



#### 2/3 padding

For pseudospectral simulations of PDEs the input is of length 2m

$$F = \{F_k\}_{k=-m}^{m-1}.$$
 (6)

A quadratic nonlinearity is transformed into a convolution:

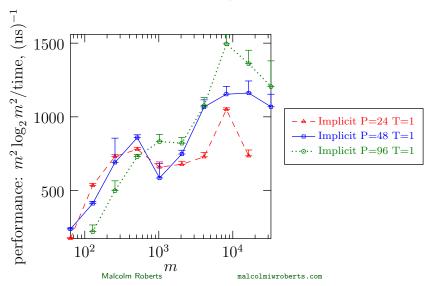
$$(F * G)_k = \sum_{\ell=k-m+1}^{m-1} F_{\ell} G_{k-\ell}$$
 (7)

One can include or exclude the Nyquist mode  $F_{-m}$ .

The implicitly dealiased convolution routines can either include (non-compact format) or exclude (compact format) the Nyquist mode.

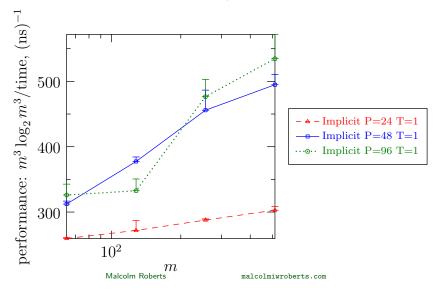
#### 2/3 padding: 2D performance

Here we are non=compact both directions:



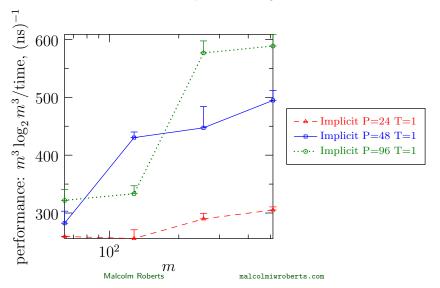
#### 2/3 padding: 3D performance

Here we are non-compact all directions:



#### 2/3 padding: 3D performance

Here we are compact in the y-direction:



#### Conclusion

In this talk, I presented the distributed memory version of implicitly dealiased convolutions.

Implicitly dealiased convolutions:

- ▶ use less memory
- have less communication costs,
- ▶ and are faster than conventional zero-padding techniques.

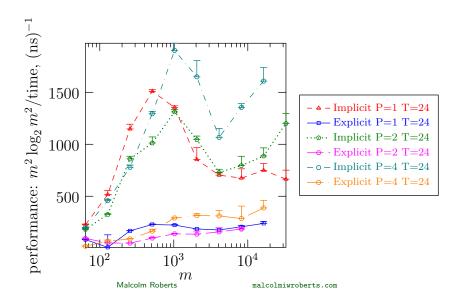
We make use of the hybrid transpose algorithm (CP13, 15:20).

Implementation in the open-source project FFTW++:

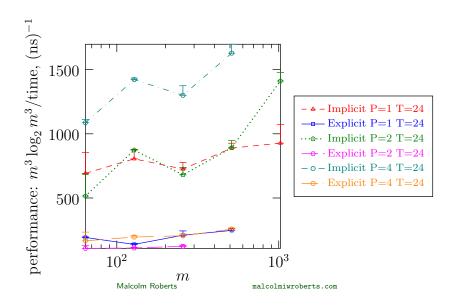
fftwpp.sf.net

Thank you for your attention!

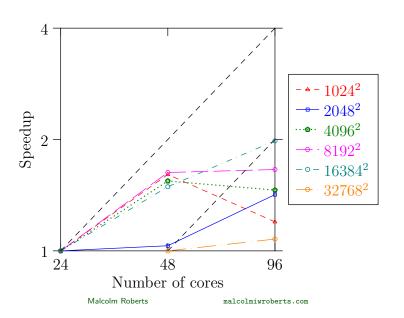
#### 1/2 padding: multithreaded 2D performance



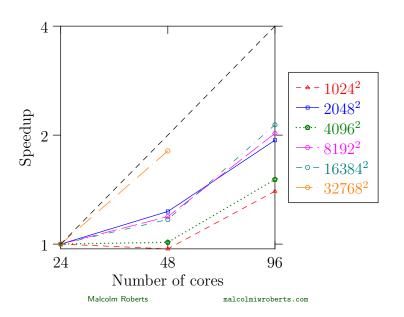
#### 1/2 padding: multithreaded 3D performance



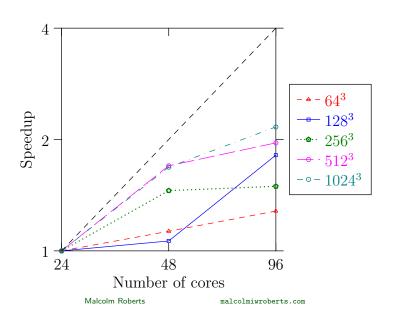
## 1/2 padding: 2D scaling



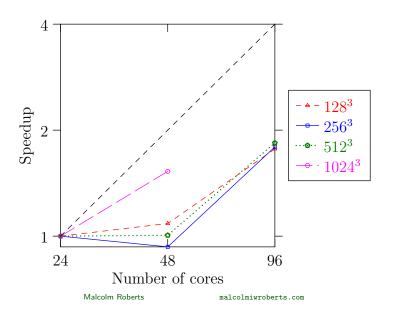
#### 1/2 padding: multithreaded 2D scaling



# 1/2 padding: 3D scaling



#### 1/2 padding: multithreaded 3D scaling



#### 1/2 padding: explicit 3D scaling

