

# Fast Poisson Solvers

- ▶ Multigrid
- ▶ Fast Fourier Transforms
- ▶ Domain Decomposition
- ▶ Fast Multipoles

# Multigrid

Here for 2D, Finite Differences,  $N \times N$  square,  $N = 2^m$ .

- ▶ Direct inversion of  $N^2 \times N^2$  matrix  $\rightarrow \frac{1}{3}N^6$  operations
- ▶ Gauss-Seidel  $N^2$  iterations  $\rightarrow N^4$  operations
- ▶ Successive-Over-Relaxtion  $N$  iterations  $\rightarrow N^3$  operations
- ▶ Multigrid  $\rightarrow N^2$  operations.

Problem with Gauss-Seidel: slow diffusion across grid of longwave errors, shortwave errors diffuse rapidly

Hence tackle longwave errors on a faster coarse grid

Coarsest grid  $\Delta x = \frac{1}{2}$ , one interior point

Finest grid  $\Delta x = \frac{1}{2^m}$ ,  $(2^m - 1)^2$  interior points

# Multigrid - sequence of problems

Sequence of Poisson problems

$$A_k x_k = b_k,$$

for grids  $k = m$ , the finest, to  $k = 1$ , the coarsest.

Make several V-cycles

Each cycle starts at the finest, descends one level at a time to the coarsest and then ascends back to the finest.

For the first cycle, start iteration with  $x_m = 0$ .

For subsequent cycles, start with  $x_m$  from previous V-cycle.

## V-cycle, the descent

Starting with  $k = m$

- ▶ Make a couple of Gauss-Seidel iterations of  $A_k x_k = b_k$ .
- ▶ Produces  $x_k^{\text{approx}}$ . Store for later use
- ▶ Calculate residue

$$\text{res}_k = b_k - A_k x_k^{\text{approx}}.$$

- ▶ Coarsen residue for forcing on the next coarser grid

$$b_{k-1} = C_k \text{res}_k \quad \text{where} \quad C_k = \frac{1}{16} \begin{pmatrix} 1 & 2 & 1 \\ 2 & 4 & 2 \\ 1 & 2 & 1 \end{pmatrix}.$$

- ▶ Store  $b_{k-1}$  for later use
- ▶ Zero  $x_{k-1}$  for starting iterations
- ▶ To courser grid:  $k \rightarrow k - 1$
- ▶ If  $k > 1$  go to the top of this list

End descent on coarsest grid ( $k = 1$ ) with just one internal point, so  $A_1 x_1 = b_1$  is one equation in one unknown, solved exactly.

## V-cycle, the ascent

Starting with  $k = 2$ .

- ▶ Coarser solution  $x_{k-1}$  interpolated to finer grid

$$x_k^{\text{correction}} = I_k x_{k-1} \quad \text{where} \quad I_k = \frac{1}{4} \begin{pmatrix} 1 & 2 & 1 \\ 2 & 4 & 2 \\ 1 & 2 & 1 \end{pmatrix}.$$

- ▶ Add this to stored  $x_k^{\text{approx}}$  from descent

$$x_k^{\text{better approx}} = x_k^{\text{approx}} + x_k^{\text{correction}}$$

- ▶ Make a couple of Gauss-Seidel iterations of  $A_k x_k = b_k$  starting from  $x_k^{\text{better approx}}$ , using stored  $b_k$
- ▶ To finer grid:  $k \rightarrow k + 1$
- ▶ If  $k < m$  go to top of this list

End ascent with  $x_m$

Multigrid not: first solve coarsest Poisson, then interpolate for starting finer. **Coarsening residue** gives different forcing

# Multigrid – costs

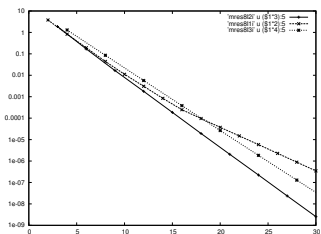
Solve on  $256 \times 256$  grid

$$\nabla^2 \psi = -2\pi^2 \sin(\pi x) \sin(\pi y)$$

Residue vs

$\#V\text{-cycles} \times \#GS \text{ iterations}$

From top, GS iterations = 1,3,2



Error reduces by 10 with 2 GS iterations at each level per V-cycle

$8N^2$  cost per V-cycle

Hence for  $10^{-4}$  accuracy, cost is  $32N^2$  cf  $2N^3$  by SOR

# Fast Fourier Transforms

See spectral methods for details of making fast transform

Poisson problem trivial in Fourier space. Cost in transforms.

For  $N \times N$  problem in 2D, there are  $N^2$  Fourier amplitudes.

- ▶ Simple calculation of amplitudes cost  $N^4$ .
- ▶ Orszag speedup gives  $N^3$ .
- ▶ Fast Fourier Transform reduces to  $N^2 \ln N$

For 3D channel flow, FT in 2 periodic directions, FD in 3rd

Invert FD tridiagonal  $\rightarrow$  cost  $N^3 \ln N$

# Domain decomposition

Good for complex geometry, very large problems – reduces memory requirements, FE and FD, parallelisable

- ▶ Divide domain into many sub-domains
- ▶ For each sub-domain, identify internal points which only involve internal variables  $x$  and boundary variables  $y$ .
- ▶ Solve internal variables  $x$  in terms of boundary variables  $y$
- ▶ Solve reduced 'Schur complement' for boundary variables  $y$ .



# Domain decomposition

For Poisson problem  $Ax = b$ , and  $K$  subdomains,  
internal variables  $x_1, x_2, \dots, x_K$  boundary variables  $y$

Internal problems

$$A_k x_k + B_k y = b_k.$$

Boundary problem

$$C_1 x_1 + C_2 x_2 + \dots + C_K x_K + D y = b_0.$$

i.e.

$$\begin{pmatrix} A_1 & & & & B_1 \\ & A_2 & & & B_2 \\ \vdots & \vdots & \ddots & & \vdots \\ & & & A_K & B_K \\ C_1 & C_2 & \dots & C_K & D \end{pmatrix} \begin{pmatrix} x_1 \\ x_2 \\ \vdots \\ x_K \\ y \end{pmatrix} = \begin{pmatrix} b_1 \\ b_2 \\ \vdots \\ b_K \\ b_0 \end{pmatrix}$$

# Domain decomposition

Solution of internal problems, parallelisable, small memory each

$$x_k = A_k^{-1}(b_k - B_k y).$$

Hence problem for boundary variables

$$(D - C_1 A_1^{-1} B_1 - \dots - C_K A_K^{-1} B_K) y = b_0 - C_1 A_1^{-1} b_1 - \dots - C_K A_K^{-1} b_K.$$

If using direct LU inversion

- ▶  $N \times N$ , full domain costs  $N^6$
- ▶  $K$  subdomains, cost  $N^6/K^3$  per subdomain +  $N^3 K^{3/2}$  boundary
- ▶ e.g.  $N = 100$ ,  $K = 25$ : full  $10^{12}$ , DD parallel  $10^9$  operations
  
- ▶  $N \times N \times N$ , full domain costs  $N^9$
- ▶  $K$  subdomains, cost  $N^9/K^3$  per subdomain +  $N^6 K$  boundary
- ▶ e.g.  $N = 100$ ,  $K = 27$ : full  $10^{18}$ , DD parallel  $10^{14}$  operations

# Fast Multipole Method

For long range interactions (potential flow or Stokes flow)

between  $N$  point-particles seems  $N^2$  problem

Clustering effect of far particles (Barnes-Hut) gives  $N \ln N$

Making clusters multipoles + polynomial local effects

(Greengard-Rokhlin) gives  $N$

Here in 2D for

$$w(z_i) = \sum_{j \neq i}^N q_j \ln(z_i - z_j),$$

# Trees, roots and leaves

Hierarchy of domains: divide initial square box into 4 equal squares; divide each sub-square into 4;  
continue through  $\ln_4 N$  levels, so on average only one in smallest.  
Some smallest will be empty, some contain more than one.

Tree structure: at any level, smaller box within is a 'child', larger box which contains it is the 'parent'.

Top of tree is 'root'.

Once branch contains no particle stop subdivision,  
Smallest non-empty box down a branch is a 'leaf'.

# Barnes-Hut algorithm

**Upward pass** from leaves to root, one level at a time

- ▶ Sum charges  $q_c$  to charge of parent  $q_p = \sum q_c$ .
- ▶ Find center of mass of charges  $z_p = \sum z_c q_c / \sum q_c$ .

**Downward pass** for each particle, starting one below root

- ▶ If box is **far**, then contribution from cluster
- ▶ If box is **not far** and not end, go down a level
- ▶ If box is **not far** and end, sum contributions of individual particles

A box which is not adjacent is **far**.

Cost in 2D is  $27N \ln_4 N$ , beats  $N^2$  if  $N > 200$

Cost in 3D is  $189N \ln_8 N$ , beats  $N^2$  if  $N > 2000$

## Fast Multipoles – upward pass

**Far shifts** of point charge at  $z_i$  to multipoles about center  $z_c$

$$\ln(z - z_i) = \ln(z - z_c) + \sum_{r=1}^{\infty} \frac{(z_c - z_i)^r}{r(z - z_c)^r}.$$

Similarity shift multipole at  $z_i$

$$\frac{1}{(z - z_i)^m} = \sum_{r=0}^{\infty} b_r^m \frac{(z_c - z_i)^r}{(z - z_c)^{m+r}},$$

where  $b_r^m$  is a binomial coefficient.

**Upward pass** from leaves to root

- ▶ Use **far shifts** to move multipoles of children to centre of parent

## Fast Multipoles – downward pass

**Local shift** of polynomial variation centred on parent  $z_p$  to centred on child  $z_c$

$$(z - z_p)^m = \sum_{r=0}^m c_r^m (z - z_c)^r (z_c - z_p)^{m-r},$$

where  $c_r^m$  is a binomial coefficient.

**Local expansion** about centre of child at  $z_c$  of multipole at  $z_b$

$$\frac{1}{(z - z_b)^m} = \sum_{r=0}^{\infty} b_r^m \frac{(z - z_c)^r}{(z_c - z_b)^{m+r}}.$$

# Fast Multipoles - downward pass

Downward pass starting at root-2

- ▶ Box inherits from parent via **local shift**
- ▶ Plus **local expansion** input from 27 newly **far** boxes with parent-boxes adjacent to own parent

At lowest level

- ▶ Evaluate resulting field at each particle
- ▶ Add direct particle-particle from particle within own box and 8 adjacent boxes



# Fast Multipoles

Errors from first multipole order not included  $m_{\max}$ , in 2D

$$\text{Error} \leq \left( \frac{1}{2\sqrt{2}} \right)^{m_{\max}+1}$$

Need  $m_{\max} = 6$  for  $10^{-3}$  accuracy ( $m_{\max} = 8$  in 3D)

Costs in 2D

$$8N + \frac{4}{3}(m_{\max} + 1)N + 36(m_{\max} + 1)^2 N$$

So for  $10^{-3}$  accuracy, need  $N > 10^4$  before faster than  $N^2$  direct particle-particle interactions

Costs in 3D

$$26N + m_{\max}^2 N + 189m_{\max}^4 N$$

So for  $10^{-3}$  accuracy, need  $N > 10^6$  before faster than  $N^2$  direct particle-particle interactions