

# Multilevel Methods for HPC Programming Task

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# Introduction

- implement multigrid for 1D and 2D Poisson
- on unit interval/unit square
- with Dirichlet boundary conditions
- implementation in Python using Numpy

# Grid Data Structure 1D

- $n$  subintervals
- grid functions are represented by `numpy` arrays
- size:  $n + 1$ , e.g. (`u = zeros(n+1)`)
- boundary points are included
- e.g. function  $u(x) = x^2$  on interval  $[0, 1]$

```
from numpy import *  
n = 8  
dx = 1.0 / n  
x = arange(n+1) * dx  
u = x**2  
print u[0], u[-1]
```

# Grid Data Structure 2D

- $n_x, n_y$  subintervals in each direction
- grid functions are represented by `numpy` arrays
- size:  $(n_x+1, n_y+1)$ , e.g. `u = zeros((n_x+1, n_y+1))`
- boundary points are included
- e.g. function  $u(x, y) = x^2 + y^2$  on interval  $[0, 1]^2$

```
from numpy import *
nx, ny = 8, 8
dx, dy = 1.0 / nx, 1.0 / ny
ix, iy = mgrid[:nx+1,:ny+1]
x, y = dx * ix, dy * iy
u = x**2 + y**2
print u[:,0], u[-1,:], u[:, -1], u[0,:]
```

# Operator Data Structures

- represent the operator  $L$  by
  - ▶ the stepsize  $\Delta x$  in 1D
  - ▶ a tuple of the stepsizes  $(\Delta x, \Delta y)$  in 2D
- this is sufficient to implement the operators needed for the Poisson equation
- represent the hierarchy of operators by a list of operator representations
- levels are represented by integer
- level 0 is the coarsest level
- level 1 is the next finer level, etc.

# Task 1D

implement the following functions

- `li_1d(uc)`
- `fwr_1d(r)`
- `residual_1d(v, L, f)`
- `rb_gs_1d(v, L, f)`
- `lex_gs_1d(v, L, f)`

Test each function individually!

You can of course create other functions as you see fit.

# Linear Interpolation 1D

- specification

$$e_{2i} = \bar{u}_i$$
$$e_{2i+1} = \frac{\bar{u}_i + \bar{u}_{i+1}}{2}$$

- the boundary values can be included in these equations

```
def li_1d(uc):  
    # uc is a grid function on a coarse grid  
    # e is a grid function on finer grid  
    # create e  
    return e
```

# Full Weighting Restriction 1D

- specification

$$\bar{f}_i = \frac{r_{2i-1} + 2r_{2i} + r_{2i+1}}{4}$$

- the boundary values can be copied
- they should be 0

```
def fwr_1d(r):  
    # r is a grid function on a fine grid  
    # fc is a grid function on coarser grid  
    # create fc  
    return fc
```



# Residual 1D

- specification

$$\bar{r}_i = f_i - (-u_{i-1} + 2u_i - u_{i+1})/\Delta x^2$$

- the values at the boundaries are 0

```
def res_1d(v, L, f):  
    # equation L u = f  
    # f is right hand side  
    # L represents operator  
    # v is approximation to u  
    # r is residual r = f - L u  
    # create r  
    return r
```

# Lexicographical Gauss-Seidel 1D

- specification

$$\bar{u}_i \leftarrow \left( \frac{2}{\Delta x^2} \right)^{-1} \left( f_i + \frac{u_{i-1} + u_{i+1}}{\Delta x^2} \right)$$

- the values at the boundaries should be copied

```
def lex_gs_1d(v, L, f):  
    # equation L u = f  
    # f is the right hand side  
    # v is an approximation to u  
    # L represents an operator  
    # w is the new approximation  
    # create w  
    return w
```

# Red-Black Gauss-Seidel 1D

- specification

$$\bar{u}_{2i+1} \leftarrow \left( \frac{2}{\Delta x^2} \right)^{-1} \left( f_{2i+1} + \frac{u_{2i} + u_{2i+2}}{\Delta x^2} \right)$$
$$\bar{u}_{2i} \leftarrow \left( \frac{2}{\Delta x^2} \right)^{-1} \left( f_{2i} + \frac{u_{2i-1} + u_{2i+1}}{\Delta x^2} \right)$$

- the values at the boundaries should be copied

```
def rb_gs_1d(v, L, f):  
    # similar to lex_gs_1d  
    # create w  
    return w
```

# Task Multigrid

- implement a multigrid V-cycle function
- test multigrid using 1D functions

# Multigrid Function

```
def multigrid(level, v, Ls, f,
              smooth, res, restrict, prolong,
              coarse_solve, cycle):
    # level: integer
    # v: initial approximation
    # Ls: hierarchy of operators
    # f: right hand side
    # smooth: w = smooth(v, L, f)
    # res: r = res(v, L, f)
    # restrict: fc = restrict(r)
    # prolong: e = prlong(uc)
    # coarse_solve: w = coarse_solve(v, L, f)
    # cycle: ignored
    # create new approximation w
    return w
```

# Task 2D

implement the following functions

- `bli_2d(uc)`
- `fwr_2d(r)`
- `residual_2d(v, L, f)`
- `rb_gs_2d(v, L, f)`
- `lex_gs_2d(v, L, f)`

Test each function individually!

# Bilinear Interpolation 2D

- specification

$$e_{2i,2j} = \bar{u}_{i,j}, \quad e_{2i+1,2j+1} = \frac{\bar{u}_{i,j} + \bar{u}_{i,j+1} + \bar{u}_{i+1,j} + \bar{u}_{i+1,j+1}}{4}$$
$$e_{2i,2j+1} = \frac{\bar{u}_{i,j} + \bar{u}_{i,j+1}}{2}, \quad e_{2i+1,2j} = \frac{\bar{u}_{i,j} + \bar{u}_{i+1,j}}{2}$$

- the boundary values can be included in these equations

```
def bli_2d(uc):  
    # uc is a grid function on a coarse grid  
    # e is a grid function on finer grid  
    # create e  
    return e
```

# Full Weighting Restriction 2D

- specification

$$\bar{f}_{i,j} = \frac{1}{16} \begin{pmatrix} r_{2i-1,2j-1} + 2r_{2i-1,2j} + r_{2i-1,2j+1} + \\ 2r_{2i,2j-1} + 4r_{2i,2j} + 2r_{2i,2j+1} + \\ r_{2i+1,2j-1} + 2r_{2i+1,2j} + r_{2i+1,2j+1} \end{pmatrix}$$

- the boundary values can be copied
- they should be 0

```
def fwr_2d(r):  
    # r is a grid function on a fine grid  
    # fc is a grid function on coarser grid  
    # create fc  
    return fc
```



# Residual 2D

- specification

$$\bar{r}_{i,j} = f_{i,j} - \left( \frac{-u_{i-1,j} + 2u_{i,j} - u_{i+1,j}}{\Delta x^2} + \frac{-u_{i,j-1} + 2u_{i,j} - u_{i,j+1}}{\Delta y^2} \right)$$

- the values at the boundaries are 0

```
def res_2d(v, L, f):  
    # equation L u = f  
    # f is right hand side  
    # L represents operator  
    # v is approximation to u  
    # r is residual r = f - L u  
    # create r  
    return r
```

# Lexicographical Gauss-Seidel 2D

- stencil

$$L = \begin{bmatrix} & & \frac{-1}{\Delta y^2} & & \\ \frac{-1}{\Delta x^2} & \frac{2}{\Delta x^2} + \frac{2}{\Delta y^2} & & & \\ & & \frac{-1}{\Delta y^2} & & \\ & & & & \\ & & & & \end{bmatrix} = \begin{bmatrix} & \bullet & \\ \bullet & \bullet & \bullet \\ & \bullet & \\ & & \bullet & \end{bmatrix}$$

- copy (boundary) values
- for  $i = 1, \dots, n_x - 1$ 
  - ▶ for  $j = 1, \dots, n_y - 1$

$$u_{i,j} \leftarrow [\bullet]^{-1} \left( f_{i,j} - \left( \begin{bmatrix} \bullet & \\ \bullet & \bullet & \end{bmatrix} u \right)_{i,j} \right)$$

# Lexicographical Gauss-Seidel 2D (cont.)

```
def lex_gs_2d(v, L, f):  
    # equation  $L u = f$   
    # f is the right hand side  
    # v is an approximation to u  
    # L represents an operator  
    # w is the new approximation  
    # create w  
    return w
```

# Red-Black Gauss-Seidel 2D

- stencil

$$L = \begin{bmatrix} & & \frac{-1}{\Delta y^2} & & \\ \frac{-1}{\Delta x^2} & & \frac{2}{\Delta x^2} + \frac{2}{\Delta y^2} & & \frac{-1}{\Delta x^2} \\ & & \frac{-1}{\Delta y^2} & & \end{bmatrix} = \begin{bmatrix} & \bullet & \\ \bullet & \bullet & \bullet \\ & \bullet & \end{bmatrix}$$

- copy (boundary) values
- for points with odd  $i + j$

$$u_{i,j} \leftarrow [\bullet]^{-1} \left( f_{i,j} - \left( \begin{bmatrix} \bullet & \\ \bullet & \bullet \\ \bullet & \end{bmatrix} u \right)_{i,j} \right)$$

- same for points with odd  $i + j$

## Red-Black Gauss-Seidel 2D (cont.)

```
def rb_gs_2d(v, L, f):  
    # equation  $L u = f$   
    # f is the right hand side  
    # v is an approximation to u  
    # L represents an operator  
    # w is the new approximation  
    # create w  
    return w
```

# Multigrid 2D

- test multigrid using 2D functions

# Solver

- put all your files in a directory  
`multigrid_task_<yourname>_<version>`
- create a file `multigrid_task.py` in it
- in this file implement the functions  
`solve_1d(g, f)` and `solve_2d(g, f)`
- make a tarred and gzipped file  
`multigrid_task_<yourname>_<version>.tar.gz`  
containing this directory and all files in it
- send this file to me  
`j.van.lent@maths.bath.ac.uk`
- use as subject "multigrid task, <yourname>"
- this code will be run with something like  
`multigrid_task_run.py`

```
# multigrid_task.py

# equation  $L u = f$ 
#  $u = g$  on boundary
# grid function  $g$ 
# only boundary values are essential
# other values may be used as
# initial approximation
def solve_1d(g, f):
    # create  $u$  using 1D multigrid
    return u
def solve_2d(g, f):
    # create  $u$  using 2D multigrid
    return u
```



```
# multigrid_task_run.py
from numpy import *
import multigrid_task

# 1D test
n = 2**8
dx = 1.0 / n
x = arange(n+1) * dx
u_exact = x**2
f = -2 + 0*x
g = u_exact.copy()
g[1:-1] = 0.0
u = multigrid_task.solve_1d(g, f)
print abs(u - u_exact).max()
```

```
# multigrid_task_run.py (cont.)

# 2D test
nx, ny = 2**8, 2**8
dx, dy = 1.0 / nx, 1.0 / ny
ix, iy = mgrid[:nx+1,:ny+1]
x, y = dx * ix, dy * iy
u_exact = x**2 + y**2
f = -4 + 0*x + 0*y
g = u_exact.copy()
g[1:-1,1:-1] = 0.0
u = multigrid_task.solve_2d(g, f)
print abs(u - u_exact).max()
```