

# A Prototype Finite Difference Model

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**Slides at:**  
<https://github.com/timkphd/slides>



# Examples at

To get examples:

```
mkdir examples
```

```
cd examples
```

```
git clone https://github.com/timkphd/examples.git
```

```
cd examples/mpi/mpi4py
```

# A Prototype Model

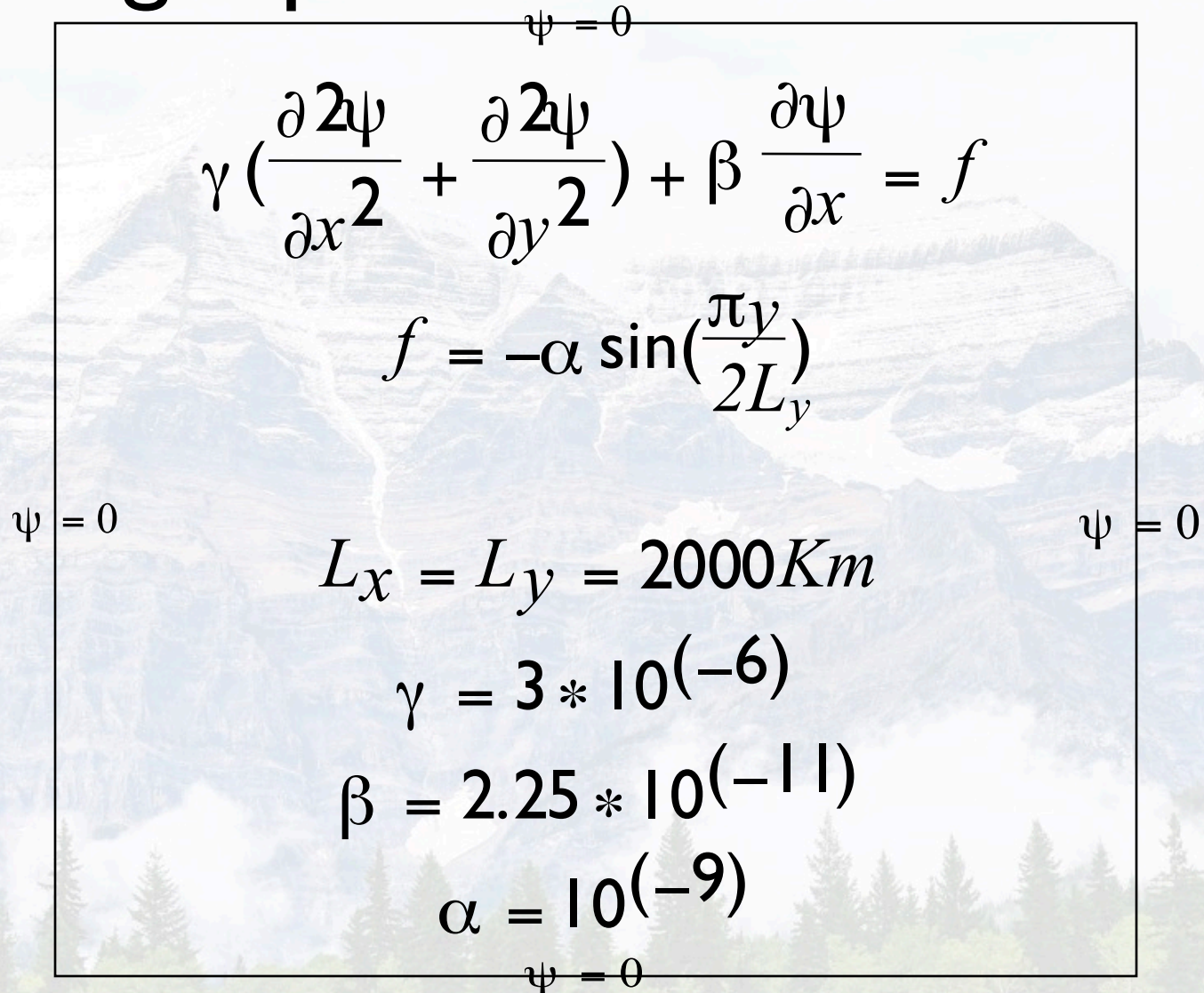
- We will introduce a finite difference model that will serve to demonstrate what a computational scientist needs to do to take advantage of Distributed Memory computers using MPI
- The model we are using is a two dimensional solution to a model problem for Ocean Circulation, the Stommel Model



# The Stommel Problem

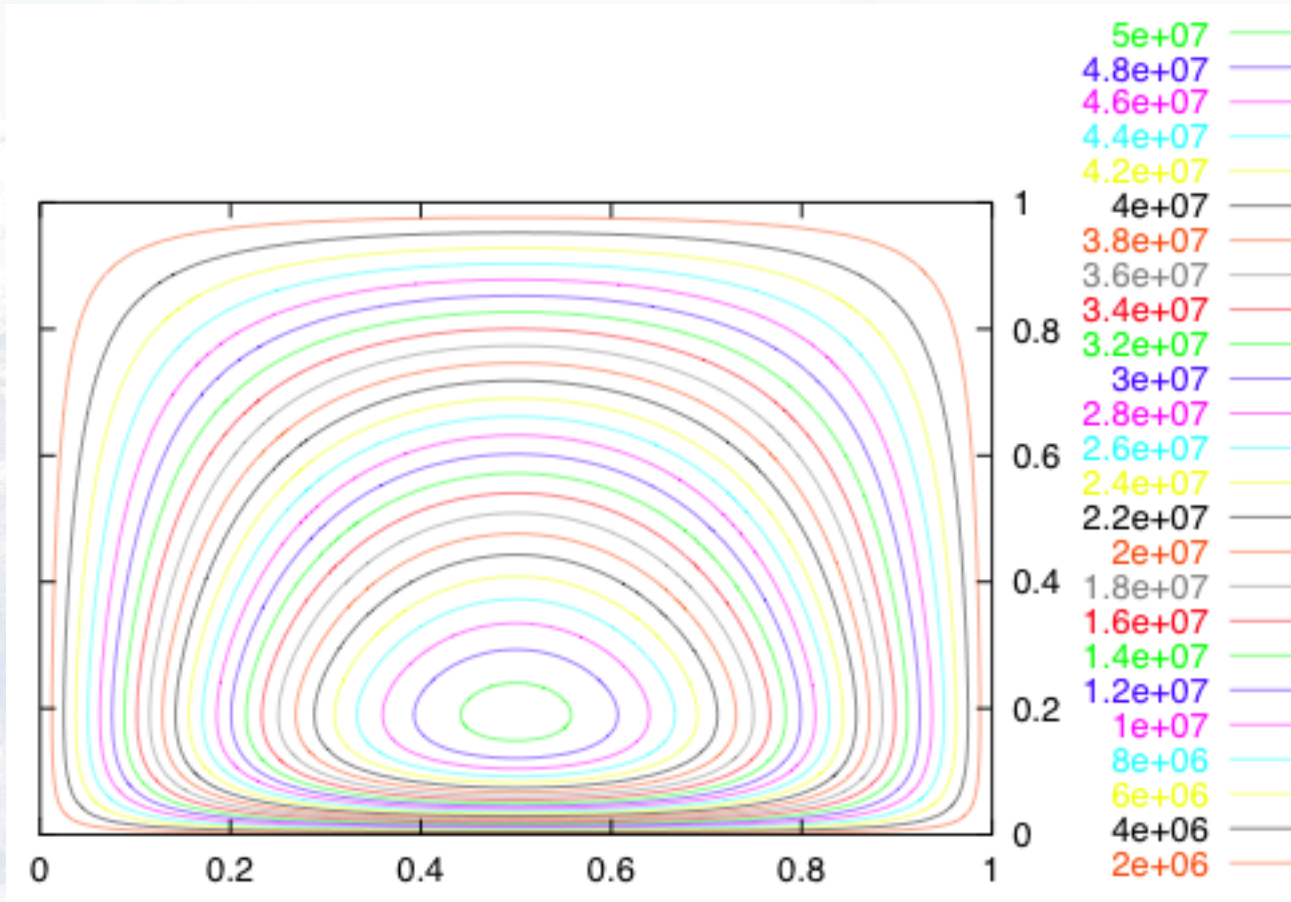
- Wind-driven circulation in a homogeneous rectangular ocean under the influence of surface winds, linearized bottom friction, flat bottom and Coriolis force.
- Solution: intense crowding of streamlines towards the western boundary caused by the variation of the Coriolis parameter with latitude

# Governing Equations Model Constants

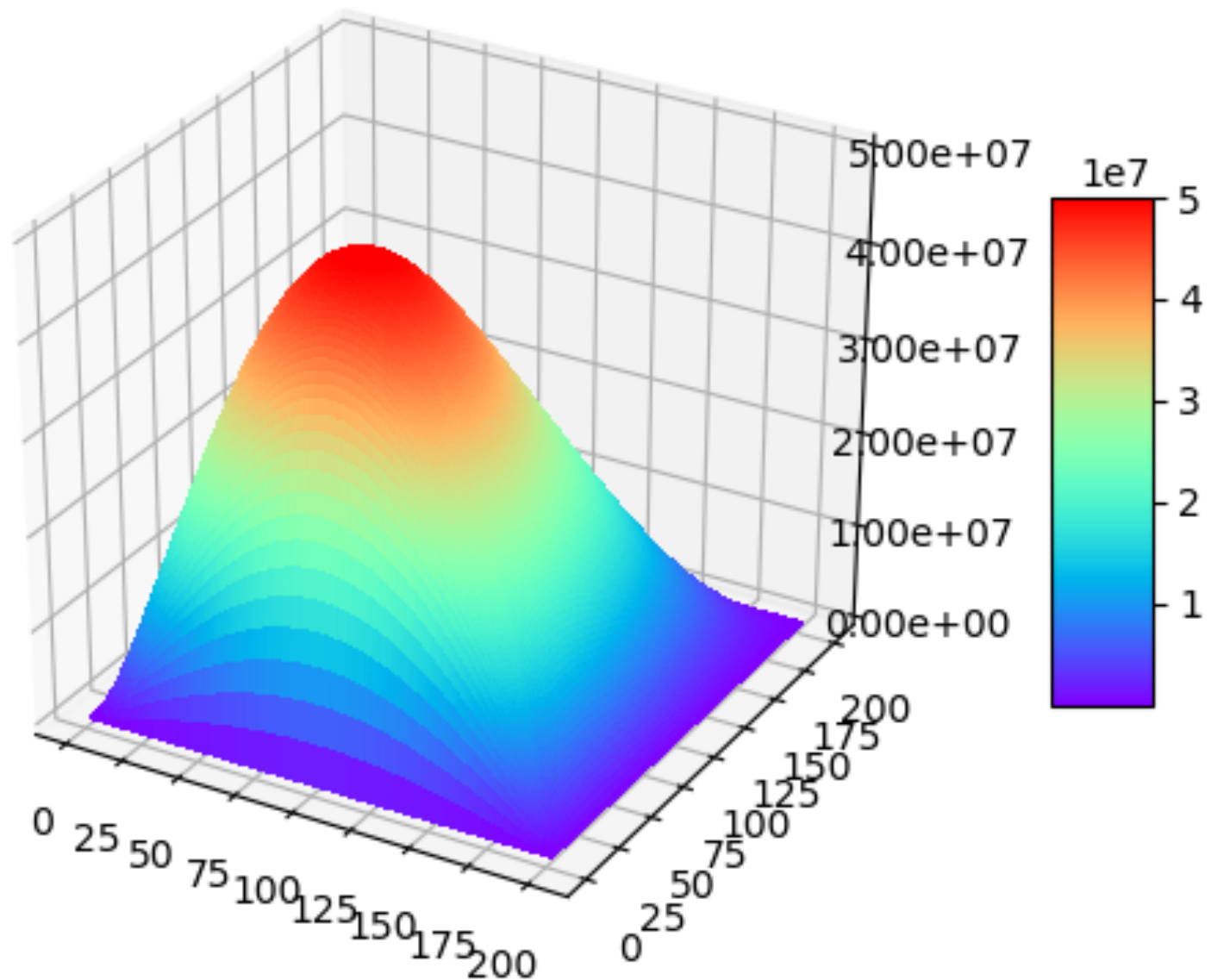

$$\psi = 0$$
$$\gamma \left( \frac{\partial^2 \psi}{\partial x^2} + \frac{\partial^2 \psi}{\partial y^2} \right) + \beta \frac{\partial \psi}{\partial x} = f$$
$$f = -\alpha \sin\left(\frac{\pi y}{2L_y}\right)$$
$$\psi = 0$$
$$L_x = L_y = 2000 \text{ Km}$$
$$\gamma = 3 * 10^{(-6)}$$
$$\beta = 2.25 * 10^{(-11)}$$
$$\alpha = 10^{(-9)}$$
$$\psi = 0$$



# The steady state solution



# The steady state solution





# Domain Discretization

Define a grid consisting of points  $(x_i, y_j)$  given by

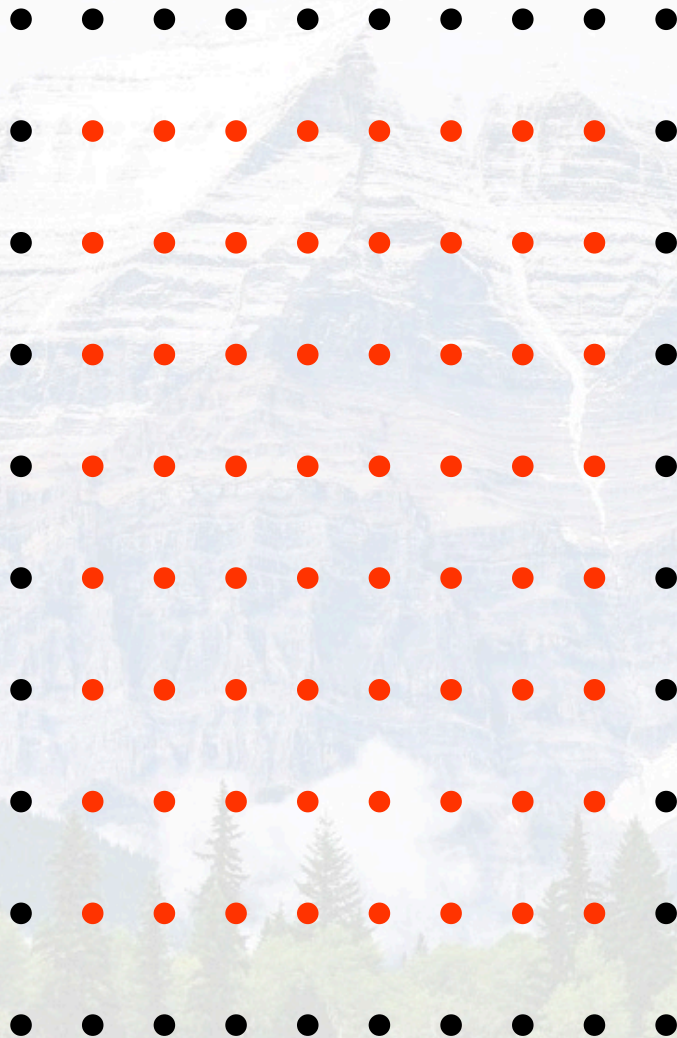
$$x_i = i\Delta x, i = 0, 1, \dots, nx+1$$

$$y_j = j\Delta y, j = 0, 1, \dots, ny+1$$

$$\Delta x = L_x / (nx + 1)$$

$$\Delta y = L_y / (ny + 1)$$

# Domain Discretization



Seek to find an  
approximate solution

$\psi(x_i, y_j)$  at points  $(x_i, y_j)$ :  
 $\psi_{i,j} \approx \psi(x_i, y_j)$



# Centered Finite Difference Scheme for the Derivative Operators

$$\frac{\partial \psi}{\partial x} \approx \frac{\psi_{i+1,j} - \psi_{i-1,j}}{2\Delta x}$$

$$\frac{\partial^2 \psi}{\partial x^2} \approx \frac{\psi_{i+1,j} - 2\psi_{i,j} + \psi_{i-1,j}}{(\Delta x)^2}$$

$$\frac{\partial^2 \psi}{\partial y^2} \approx \frac{\psi_{i,j+1} - 2\psi_{i,j} + \psi_{i,j-1}}{(\Delta y)^2}$$

# Governing Equation

## Finite Difference Form

$$\psi_{i,j} = a_1\psi_{i+1,j} + a_2\psi_{i-1,j} + a_3\psi_{i,j+1} + a_4\psi_{i,j-1} - a_5 f_{i,j}$$

$$a_1 = \frac{\Delta y^2}{2(\Delta x^2 + \Delta y^2)} + \frac{\beta \Delta x^2 \Delta y^2}{4\gamma \Delta x (\Delta x^2 + \Delta y^2)}$$

$$a_2 = \frac{\Delta y^2}{2(\Delta x^2 + \Delta y^2)} - \frac{\beta \Delta x^2 \Delta y^2}{4\gamma \Delta x (\Delta x^2 + \Delta y^2)}$$

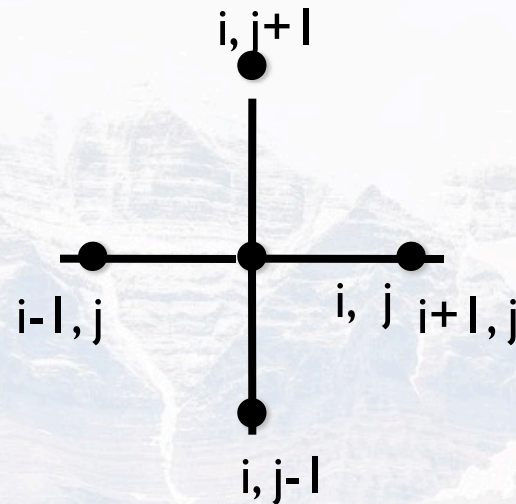
$$a_3 = \frac{\Delta x^2}{2(\Delta x^2 + \Delta y^2)}$$

$$a_4 = \frac{\Delta x^2}{2(\Delta x^2 + \Delta y^2)}$$

$$a_5 = \frac{\Delta x^2 \Delta y^2}{2\gamma (\Delta x^2 + \Delta y^2)}$$



# Five-point Stencil Approximation



interior grid points:  $i=1, nx$ ;  
 $j=1, ny$

boundary points:  
 $(i, 0) \text{ \& } (i, ny+1) ; i=0, nx+1$   
 $(0, j) \text{ \& } (nx+1, j) ; j=0, ny+1$

$$\psi_{i,j} = a_1 \psi_{i+1,j} + a_2 \psi_{i-1,j} + a_3 \psi_{i,j+1} + a_4 \psi_{i,j-1} - a_5 f_{i,j}$$

$$\psi_{i,0} = \psi_{i,ny+1} = 0; \quad \psi_{0,j} = \psi_{nx+1,j} = 0;$$

# Jacobi Iteration

Start with an initial guess for  $(\psi_{i,j})$

Repeat the process

do  $i = 1, nx; j = 1, ny$

$$(\psi_{i,j})_{new} = a_1(\psi_{i+1,j}) + a_2(\psi_{i-1,j}) + \\ a_3(\psi_{i,j+1}) + a_4(\psi_{i,j-1}) - \\ a_5 f_{i,j}$$

end do

$$(\psi_{i,j}) = (\psi_{i,j})_{new}$$



# Our Examples

We have a finite difference model that will serve to demonstrate what a computational scientist needs to do to take advantage of Distributed Memory computers using MPI.

The model we are using is a two dimensional solution to a model problem for Ocean Circulation, the Stommel Model. It has Wind-driven circulation in a homogeneous rectangular ocean under the influence of surface winds, linearized bottom friction, flat bottom and Coriolis force.

Solution: intense crowding of streamlines towards the western boundary caused by the variation of the Coriolis parameter with latitude.

For a description of the Fortran and C versions of this program see:

[http://geco.mines.edu/prototype/Show\\_me\\_some\\_local\\_HPC\\_tutorials/stoma.pdf](http://geco.mines.edu/prototype/Show_me_some_local_HPC_tutorials/stoma.pdf)

[http://geco.mines.edu/prototype/Show\\_me\\_some\\_local\\_HPC\\_tutorials/stomb.pdf](http://geco.mines.edu/prototype/Show_me_some_local_HPC_tutorials/stomb.pdf)

The python version, stp.py, follows this C version except it does a 1d decomposition. The C version is 1500x faster than the python version.

pcalc.py and ccalc.c are similar except they create a new communicator that contains N-1 tasks. These tasks do the calculation and pass data to the remaining task to be plotted. Thus we can have "C" do the heavy calculation and python do plotting.

File	Comment
<a href="#"><u>ccalc.c</u></a>	<a href="#"><u>parallel</u></a>
<a href="#"><u>stc_03.c</u></a>	<a href="#"><u>parallel</u></a>
<a href="#"><u>pcalc.py</u></a>	<a href="#"><u>parallel</u></a>
<a href="#"><u>stp_00.py</u></a>	<a href="#"><u>serial</u></a>
<a href="#"><u>stp.py</u></a>	<a href="#"><u>parallel</u></a>
<a href="#"><u>tiny.in</u></a>	<a href="#"><u>tiny input file</u></a>
<a href="#"><u>small.in</u></a>	<a href="#"><u>small input file</u></a>
<a href="#"><u>st.in</u></a>	<a href="#"><u>regular input file</u></a>

# Python Version

```
#!/usr/bin/env python
from math import pi,sin
from math import fabs as abs
#from Numeric import empty
from numpy import empty
import numpy
from time import time as walltime
global vals,cons
global psi,new_psi,forf
import sys
global a1,a2,a3,a4,a5,a6,dx,dy
global r1,r2
global ttol
```



# Python Version

```
class constants:
    a1,a2,a3,a4,a5,a6,dx,dy=(0.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0)
    def __init__(this,inputs):
        dx=inputs.lx/(inputs.nx+1.0)
        dy=inputs.ly/(inputs.ny+1.0)
        dx2=dx*dx
        dy2=dy*dy
        bottom=2.0*(dx2+dy2)
        a1=(dy2/bottom)+(inputs.beta*dx2*dy2)/(2.0*inputs.gamma*dx*bottom)
        a2=(dy2/bottom)-(inputs.beta*dx2*dy2)/(2.0*inputs.gamma*dx*bottom)
        a3=dx2/bottom
        a4=dx2/bottom
        a5=dx2*dy2/(inputs.gamma*bottom)
        a6=pi/(inputs.ly)
        this.dx=dx
        this.dy=dy
        this.a1=a1
        this.a2=a2
        this.a3=a3
        this.a4=a4
        this.a5=a5
        this.a6=a6
    def getCons(this):
        return(this.a1,this.a2,this.a3,this.a4,this.a5,this.a6,this.dy,this.dx)
```

# Python Version

```
class input:
    nx,ny=(50 , 50)
    lx,ly=(2000000 , 2000000)
    alpha,beta,gamma=(1.0e-9 , 2.25e-11 , 3.0e-6)
    steps=5000
    def __init__(this):
        pass
    def getInput(this):

return(this.nx,this.ny,this.lx,this.ly,this.alpha,this.beta,
this.gamma,this.steps)
```



# Python Version

```
def do_force(forf,i1,i2,j1,j2):  
    def force(y):  
        global cons,vals  
        return(-vals.alpha*sin(y*cons.a6))  
    for i in range(i1-1,i2+2):  
        for j in range(j1-1,j2+2):  
            y=j*cons.dy  
            forf[i,j]=force(y)
```

```
def bc(psi,i1,i2,j1,j2):  
    psi[i1-1,:]=0.0  
    psi[i2+1,:]=0.0  
    psi[:,j1-1]=0.0  
    psi[:,j2+1]=0.0
```

# Python Version

```
def do_jacobi(psi,new_psi,i1,i2,j1,j2):
# does a single Jacobi iteration step
# input is the grid and the indices for the interior cells
# new_psi is temp storage for the the updated grid
# output is the updated grid in psi and diff which is
# the sum of the differences between the old and new grids
    global cons
    global forf
    global ttot
    global a1,a2,a3,a4,a5,a6,dx,dy
    diff=0.0
    ts=walltime()
    for j in r2:
        for i in r1:
            new_psi[i,j]=a1*psi[i+1,j] + a2*psi[i-1,j] + \
                a3*psi[i,j+1] + a4*psi[i,j-1] - \
                a5*forf[i,j]
            diff=diff+abs(new_psi[i,j]-psi[i,j])
    psi[:,:]=new_psi[:,:]
    te=walltime()
    ttot=ttot+(te-ts)
    return (diff)
```



# Python Version

```
#get the input.  see above for typical values
vals=input()

#set the indices for the interior of the grid
i1=1
i2=vals.nx
j1=1
j2=vals.ny
# allocate the grid to size nx * ny plus the boundary cells
t1=walltime()
psi=empty(((i2-i1)+3,(j2-j1)+3),"d")
new_psi=empty(((i2-i1)+3,(j2-j1)+3),"d")
forf=empty(((i2-i1)+3,(j2-j1)+3),"d")
#calculate the constants for the calculations
cons=constants(vals)
(a1,a2,a3,a4,a5,a6,dx,dy)=cons.getCons()

# set initial guess for the value of the grid
psi[:,:]=1.0
do_force(forf,i1,i2,j1,j2)
#set boundary conditions
bc(psi,i1,i2,j1,j2)
```

# Python Version

```
new_psi[:,:] = psi[:,:]
iout = vals.steps // 100
if (iout == 0):
    iout = 1
r1 = range(i1, i2 + 1)
r2 = range(j1, j2 + 1)
ttot = 0
for i in range(0, vals.steps):
    diff = do_jacobi(psi, new_psi, i1, i2, j1, j2)
    if ((i + 1) % iout) == 0:
        print(i + 1, diff)
t2 = walltime()
write_it(psi, i1, i2, j1, j2, i2, j2)
print("total time=", t2 - t1, " time spent in do_jacobi=", ttot)
```



# Python Version

```
def write_it(psi,i1, i2, j1, j2,nx,ny):
    from numpy import empty
    myid=100
    if(i1==1):
        i0=0
    else :
        i0=i1
        fname="out"+str(myid)
        eighteen=open(fname,"w")
    if(i2==nx):
        i3=nx+1
        aline=(str(i3-i0+1)+" , "+str(j3-j0+1)+"
"+str(psi.shape))
    else :
        i3=i2
        eighteen.write(aline+"\n")
    if(j1==1):
        j0=0
        for i in range(i0,i3+1) :
            for j in range(j0,j3+1) :
                xout=str(psi[i][j])
                eighteen.write(xout)
    else :
        j0=j1
        if(j2==ny):
            if(j != j3):
                eighteen.write(" ")
            eighteen.write("\n")
        else :
            eighteen.write("\n")
        eighteen.close()
```

# **A Prototype Finite Difference Model (Philosophy)**



# Overview

- Model written in Fortran 90
- Uses many new features of F90
  - Free format
  - Modules instead of commons
  - Module with kind precision facility
  - Interfaces
  - Allocatable arrays
  - Array syntax

<http://inside.mines.edu/~tkaiser/fortran/>

<http://inside.mines.edu/~tkaiser/fortran/new/>

# Free Format

- Statements can begin in any column
- ! Starts a comment
- To continue a line use a “&” on the line to be continued



# Modules instead of commons

- Modules have a name and can be used in place of named commons
- Modules are defined outside of other subroutines
- To “include” the variables from a module in a routine you “use” it
- The main routine stommel and subroutine jacobi share the variables in module “constants”

```
module constants
    real dx,dy,a1,a2,a3,a4,a5,a6
end module
...
program stommel
    use constants
...
end program
```

```
subroutine jacobi
    use constants
...
end subroutine jacobi
```

# Kind precision facility

Instead of declaring variables

```
real*8 x,y
```

We use

```
real(b8) x,y
```

Where b8 is a constant defined within a module

```
module numz
  integer,parameter::b8=selected_real_kind(14)
end module
program stommel
  use numz
  real(b8) x,y
  x=1.0_b8
```

...



# Kind precision facility Why?

Legality

Portability

Reproducibility

Modifiability

is not legal syntax in Fortran 90

**Declaring variables “double precision” will give us 16 byte  
reals on some machines**

```
integer,parameter::b8=selected_real_kind(14)  
real(b8) x,y  
x=1.0_b8
```

# Allocatable arrays

- We can declare arrays to be allocatable
- Allows dynamic memory allocation
- Define the size of arrays at run time

```
real(b8),allocatable::psi(:,,:)      ! our calculation grid  
real(b8),allocatable::new_psi(:,,:) ! temp storage for the grid
```

```
! allocate the grid to size nx * ny plus the boundary cells  
allocate(psi(0:nx+1,0:ny+1))  
allocate(new_psi(0:nx+1,0:ny+1))
```



# Interfaces

- Similar to C prototypes
- Can be part of the routines or put in a module
- Provides information to the compiler for optimization
- Allows type checking

```
module face
  interface bc
    subroutine bc (psi,i1,i2,j1,j2)
      use numz
      real(b8),dimension(i1:i2,j1:j2):: psi
      integer,intent(in):: i1,i2,j1,j2
    end subroutine
  end interface
end module
program stommel
  use face
  ...
```

# Array Syntax

**Allows assignments of arrays without do loops**

```
! allocate the grid to size nx * ny plus the boundary cells  
allocate(psi(0:nx+1,0:ny+1))  
allocate(new_psi(0:nx+1,0:ny+1))
```

```
! set initial guess for the value of the grid  
psi=1.0_b8
```

```
! copy from temp to main grid  
psi(i1:i2,j1:j2)=new_psi(i1:i2,j1:j2)
```



# Program Outline (I)

- Module NUMZ - defines the basic real type as 8 bytes
- Module INPUT - contains the inputs
  - nx,ny (Number of cells in the grid)
  - lx,ly (Physical size of the grid)
  - alpha,beta,gamma (Input calculation constants)
  - steps (Number of Jacobi iterations)
- Module Constants - contains the invariants of the calculation

# Program Outline (2)

- Module face - contains the interfaces for the subroutines
  - bc - boundary conditions
  - do\_jacobi - Jacobi iterations
  - force - right hand side of the differential equation
  - Write\_grid - writes the grid



# Program Outline (3)

- Main Program
  - Get the input
  - Allocate the grid to size  $n_x * n_y$  plus the boundary cells
  - Calculate the constants for the calculations
  - Set initial guess for the value of the grid
  - Set boundary conditions using
  - Do the jacobi iterations
  - Write out the final grid

# C version considerations

- To simulate the F90 numerical precision facility we:
  - `#define FLT double`
  - And use FLT as our real data type throughout the rest of the program
- We desire flexibility in defining our arrays and matrices
  - Arbitrary starting indices
  - Contiguous blocks of memory for 2d arrays
  - Use routines based on *Numerical Recipes in C*



# Vector allocation routine

```
FLT *vector(INT nl, INT nh)
{
    /* creates a vector with bounds vector[nl:nh]] */
    FLT *v;
    /* allocate the space */
    v=(FLT *)malloc((unsigned) (nh-nl+1)*sizeof(FLT));
    if (!v) {
        printf("allocation failure in vector()\n");
        exit(1);
    }
    /* return a value offset by nl */
    return v-nl;
}
```

# Matrix allocation routine

```
FLT **matrix(INT nrl,INT nrh,INT ncl,INT nch)
/* creates a matrix with bounds matrix[nrl:nrh][ncl:nch] */
/* modified from the book version to return contiguous space */
{
    INT i;
    FLT **m;
    /* allocate an array of pointers */
    m=(FLT **) malloc((unsigned) (nrh-nrl+1)*sizeof(FLT*));
    if (!m){
        printf("allocation failure 1 in matrix()\n"); exit(1);}
    m -= nrl; /* offset the array of pointers by nrl */
    for(i=nrl;i<=nrh;i++) {
        if(i == nrl){
            /* allocate a contiguous block of memroy*/
            m[i]=(FLT *) malloc((unsigned) (nrh-nrl+1)*(nch-ncl+1)*sizeof(FLT));
            if (!m[i]){
                printf("allocation failure 2 in matrix()\n");exit(1); }
            m[i] -= ncl; /* first pointer points to beginning of the block */
        }
        else {
            m[i]=m[i-1]+(nch-ncl+1); /* rest of pointers are offset by stride */
        }
    }
    return m;
}
```



# Digression... a 3d Volume allocation routine

Same idea but we allocate an array of **slices**

```
FLT ***cube(INT nslice1,INT nslice2,INT nrow1,INT nrow2,INT ncol1,INT ncol2) {
FLT **slice(INT nrow1,INT nrow2,INT ncol1,INT ncol2,FLT **temp);
FLT *temp,***mcube;
INT i;
mcube=(FLT ***) malloc((unsigned) (nslice2-nslice1+1)*sizeof(FLT*));
if (!mcube){
    printf("allocation failure at 1 in cube()\n");
    return NULL;
}
mcube -= nslice1;
temp=(FLT*) malloc((unsigned) (nslice2-nslice1+1)*
                    (nrow2-nrow1+1)*
                    (ncol2-ncol1+1)*sizeof(FLT));

if (*temp){
    printf("allocation failure at 2 in cube()\n");
    return NULL;
}
for(i=nslice1;i<=nslice2;i++) {
    mcube[i]=slice(nrow1, nrow2, ncol1, ncol2,&temp);
    if(!mcube[i]) return NULL;
    temp += (nrow2-nrow1+1)*(ncol2-ncol1+1);
}
return mcube;
}
```

# Digression... a 3d version of this routine

## Our slice allocation routine

```
FLT **slice(INT nrow1,INT nrow2,INT ncol1,INT ncol2,FLT **temp) {
    INT i;
    FLT **mslice;
    mslice=(FLT **) malloc((unsigned) (nrow2-nrow1+1)*sizeof(FLT*));
    if (!mslice){
        printf("allocation failure at 3 in slice()\n");
        return NULL;
    }
    mslice -= nrow1;
    for(i=nrow1;i<=nrow2;i++) {
        if(i == nrow1){
            mslice[i]=*temp;
            mslice[i] -= ncol1;
        }
        else {
            mslice[i]=mslice[i-1]+(ncol2-ncol1+1);
        }
    }
    return mslice;
}
```