

#### Overview

- epcc
- Boundary Value Problem: pollution model
- Solution using Jacobi
- · Discretisation of time-dependent problem
- Euler equations
- Stability
- Implicit methods
- Error Analysis
- Other equations

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#### **Pollution Model**

- epcc
- · Previously posed as a boundary value problem
  - ie static in time
- What is the solution to:  $-\bigg(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}\bigg)u(x,y)=0$ 
  - with u = 0 on north, south and west boundaries
  - and u = hump function on east boundary (location of chimney)
- · Discretised equations using standard recipes
  - eg 5-point stencil for derivative
- Solved using standard methods
  - eg Jacobi, Over-Relaxed Gauss-Seidel, Conjugate Gradient (later), ...

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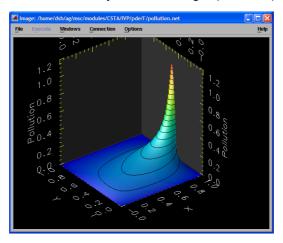
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# **Example Solution**

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- Use a 72x72 grid
  - included a north-easterly wind of strength (10.0, 4.0)



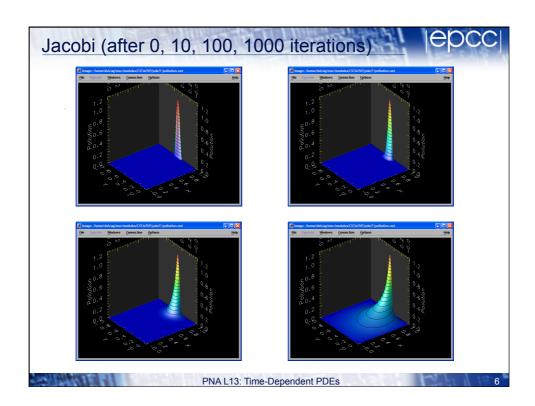
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#### **Evolution of the Solution**



- Initial guess to solution is the hump function
  - ie the situation when chimney is just switched on
- Final output is the static solution
  - ie the situation when the chimney has been on for a long time
- · What about the intermediate solutions
  - are they related in any way to the actual evolution in time?
- With Jacobi, yes ...

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## How do we get real time evolution?



- This is an Initial Value Problem
  - specify the solution at time t = 0
  - need to know the solution at some later time t
- · Similar issues to orbits practical
  - initialise position
  - compute force
  - update position
- · Except we have many variables to update
  - here, pollution the values at more than 5000 points (on 72x72 grid)
  - force term is calculated from the grid

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7

## **Diffusion Equation**



- $\bullet \ \ \text{We have considered}: \ \ \nabla^2 u(x,y) = \left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right) u(x,y) = 0$ 
  - this is an example of an elliptic equation
- Full problem is actually:  $\frac{\partial u}{\partial t} = \nabla^2 u(x,y)$ 
  - this is an example of a parabolic equation
- We have already solved the static solution
  - ie have set time derivative to zero
  - but what if we want to track the evolution in time?

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## Discretisation in space and time



- Use a simple five-point stencil for the RHS with spacing h
- Use a simple forward difference for LHS with timestep dt

$$\frac{\partial u}{\partial t} \approx \frac{u^{(t+dt)} - u^{(t)}}{dt}$$

- superscript refers to real time t and not "computer time" n
- Full equations are:  $\frac{\partial u}{\partial t} = \nabla^2 u(x,y)$ 
  - $\ \, \text{discretised:} \quad \frac{u_{i,j}^{(t+dt)} u_{i,j}^{(t)}}{dt} \ = \ u_{i,j-1}^{(t)} + u_{i-1,j}^{(t)} 4u_{i,j}^{(t)} + u_{i+1,j}^{(t)} + u_{i,j+1}^{(t)}$

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### Euler update



- A simple explicit scheme
- Jacobi:  $u_{i,j} = \frac{1}{4}(u_{i,j-1} + u_{i-1,j} + u_{i+1,j} + u_{i,j+1})$
- =>  $u_{i,j} = u_{i,j} + \frac{1}{4}(u_{i,j-1} + u_{i-1,j} 4u_{i,j} + u_{i+1,j} + u_{i,j+1})$
- Time dependent:

$$u_{i,j}^{(t+dt)} = u_{i,j}^{(t)} + dt \left( u_{i,j-1}^{(t)} + u_{i-1,j}^{(t)} - 4u_{i,j}^{(t)} + u_{i+1,j}^{(t)} + u_{i,j+1}^{(t)} \right)$$

- Notes
  - Jacobi update corresponds to time integration with dt = 0.25!
  - smaller values of dt will give more accurate intermediate solutions
    - but will require more timesteps and hence more work
  - should always arrive at the same static solution (eventually) if it exists
  - in real situations there might be no static solution (eg turbulent flow)

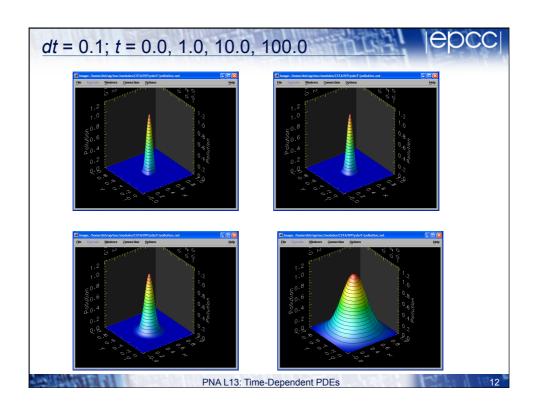
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## Checking the accuracy



- Initial Value Problems are a leap in the dark
  - how do we know if the solution is correct?
- Need to be careful
  - can sometimes monitor conserved quantities, for example the total amount of pollution
  - also look at solution visually
- Start with the hump in the middle
  - easier to understand: pollution stays away from boundaries for longer
  - pollution does not disappear for the initial timesteps
- Note that the height actually decreases as the width widens
  - visualisation software (unfortunately) rescales the z-axis

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#### Stability



- · Can perform a formal analysis of stability
  - following Von Neumann
- This shows that, for stability in the 2D diffusion problem we require dt <= 0.25</li>
  - Jacobi algorithm therefore uses the maximum timestep
- · But what happens if we go beyond this?
  - see exercise!

See Link

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13

### **Other Schemes**



• Imagine evaluating the derivative at time t+dt

$$\frac{u_{i,j}^{(t+dt)} - u_{i,j}^{(t)}}{dt} \ = \ \nabla^2 u^{(t+dt)}$$

- This gives an  $\mathit{implicit}$  scheme:  $\left(1-dt \ \nabla^2\right) u^{(t+dt)} = u^{(t)}$ 
  - must solve a full boundary value problem at every timestep!
  - however, it is always stable so can use a much larger dt
- Many other integration schemes exist
  - more stable than Euler
  - allow larger timesteps

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#### Error analysis: second derivative

$$\nabla^2 u(x) \approx u_{i-1} - 2u_i + u_{i+1}$$

$$u_{i-1} = u(x-h) = u(x) - h \frac{du}{dx} + \frac{h^2}{2} \frac{d^2u}{dx^2} - \frac{h^3}{6} \frac{d^3u}{dx^3} + O(h^4)$$

$$u_{i+1} = u(x+h) = u(x) + h \frac{du}{dx} + \frac{h^2}{2} \frac{d^2u}{dx^2} + \frac{h^3}{6} \frac{d^3u}{dx^3} + O(h^4)$$

$$\frac{1}{h^2} (u_{i-1} - 2u_i + u_{i+1}) = \frac{d^2u}{dx^2} + O(h^2)$$

- Expression is therefore accurate to second order in h
  - straightforward to extend to 2D
  - note we've previously been rather lax about units, ie factors of  $h^2$  etc

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15

#### First derivative



$$\begin{split} \frac{\partial u}{\partial t} &\approx \frac{u^{(t+dt)} - u^{(t)}}{dt} \\ \frac{u^{(t+dt)} - u^{(t)}}{dt} &= \frac{\partial u}{\partial t} + O(dt) \end{split}$$

- · Euler integration is only accurate to first order
  - but very simple!

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## Units for diffusion equation



- Actual diffusion equation is:  $\frac{\partial u}{\partial t} = D \nabla^2 u$ 
  - diffusion constant *D* is large for a gas, small for treacle, ...
- Full update equations are:

$$u_{i,j}^{(t+dt)} \ = \ u_{i,j}^{(t)} + \frac{Ddt}{h^2} \, \left( u_{i,j-1}^{(t)} + u_{i-1,j}^{(t)} - 4 u_{i,j}^{(t)} + u_{i+1,j}^{(t)} + u_{i,j+1}^{(t)} \right)$$

- previously we set  $D = h^2$  for simplicity
- Stability condition is  $dt \le h^2/(4D)$ 
  - this is the Courant-Friedrichs-Lewy (CFL) condition
- · Euler is impractical for the diffusion equation
  - halving h means reducing dt by a factor of 4 ...

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47

## Other equations



• An important equation is the wave equation (1D and 2D)

$$\frac{\partial^2 u}{\partial t^2} = c^2 \frac{\partial^2 u}{\partial x^2}$$

$$\frac{\partial^2 u}{\partial t^2} = c^2 \, \nabla^2 u$$

- Describes waves travelling with velocity c
  - sound
  - \_ water
  - electromagnetic
  - .
- This is a hyperbolic equation

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## **Boundary conditions**



- · We have used very simple fixed boundary conditions
  - these are Dirichlet conditions
  - eg pollution is zero on the boundary
  - eg simply set  $u_{i,0}$  = 0 to force this on the southern boundary
- · May want conditions on the derivative
  - eg pollution is constant across the southern boundary
  - ie  $\frac{\partial u}{\partial y} = 0$  for all values of x at y = 0
- Compute discrete form using Taylor expansion
  - here it is simply  $u_{i,0} = u_{i,1}$  on the southern boundary
  - re-impose this condition every time we update *u*

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10

#### Exercise



- Look at stability of Euler Integration for 2D diffusion
  - vary dt
  - what happens when the CFL condition is violated?
  - is the total amount of pollution conserved?
  - what happens when boundary conditions are changed?

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