

# **Data Visualization**

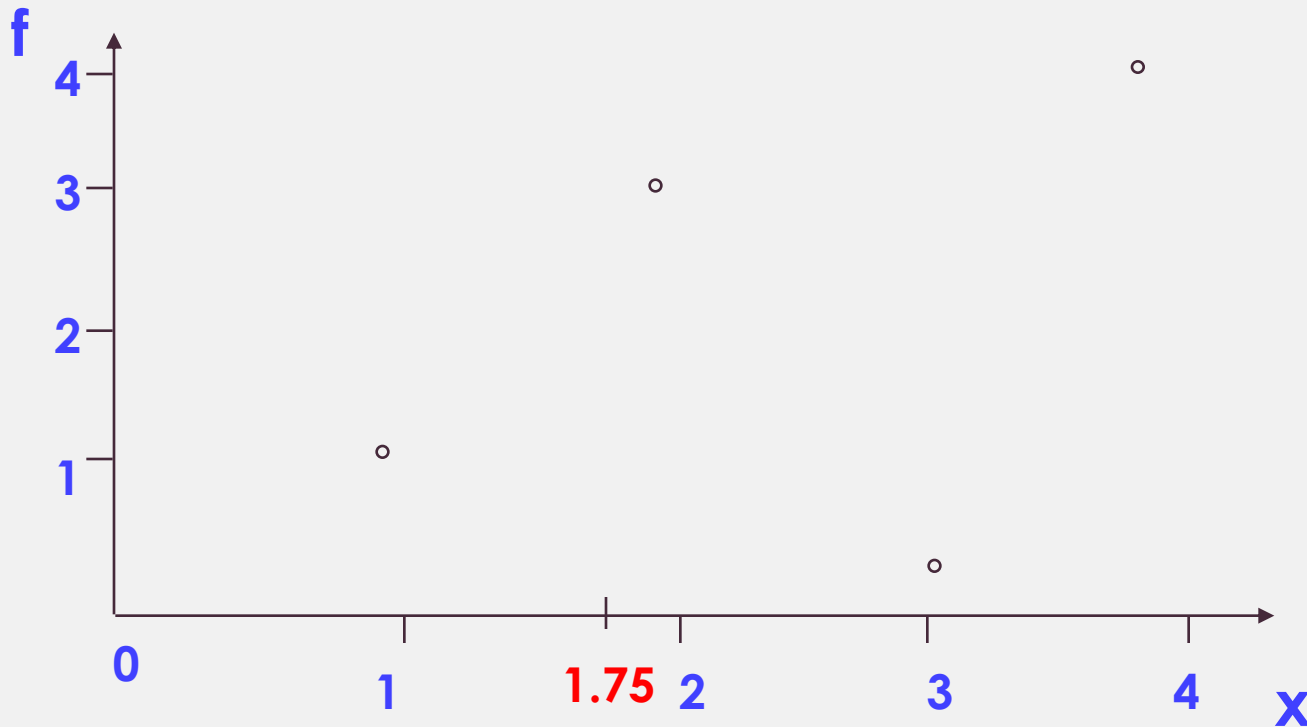
**Visualization Techniques -**

**1D Scalar Data**

**2D Scalar Data**

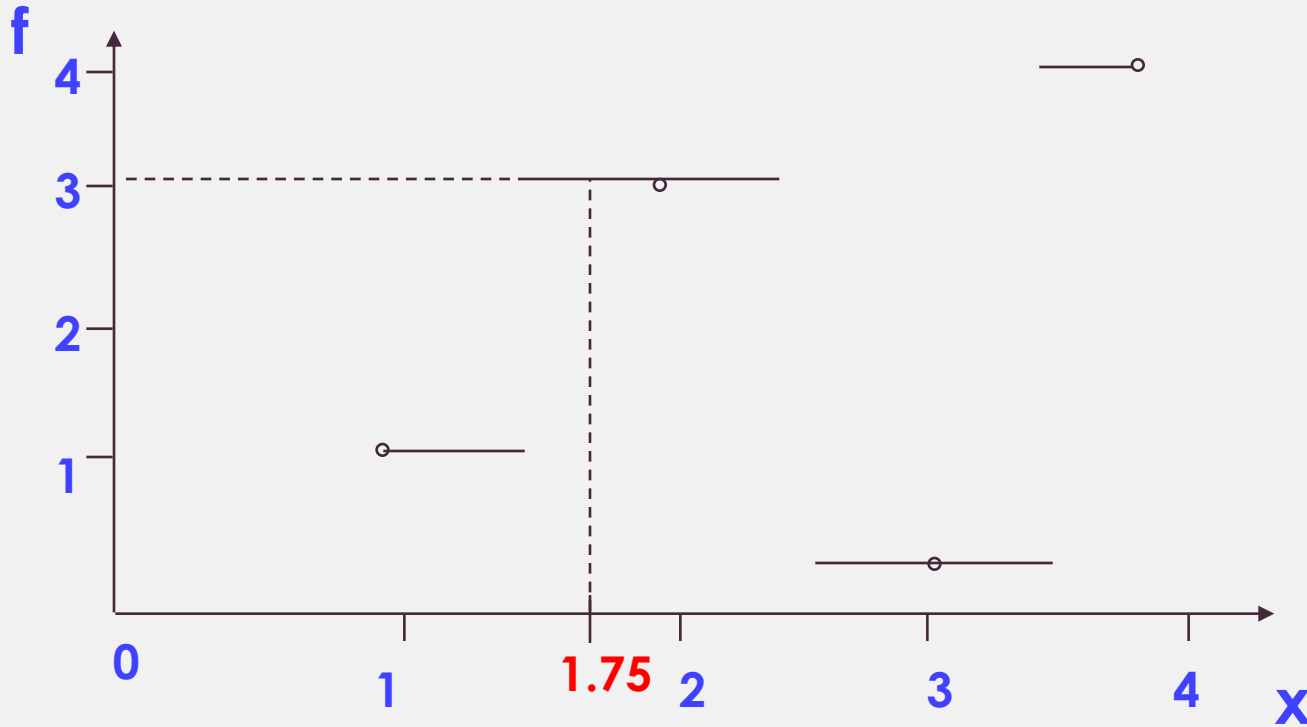
# **Visualization Techniques - One Dimensional Scalar Data**

# 1D Interpolation -The Problem



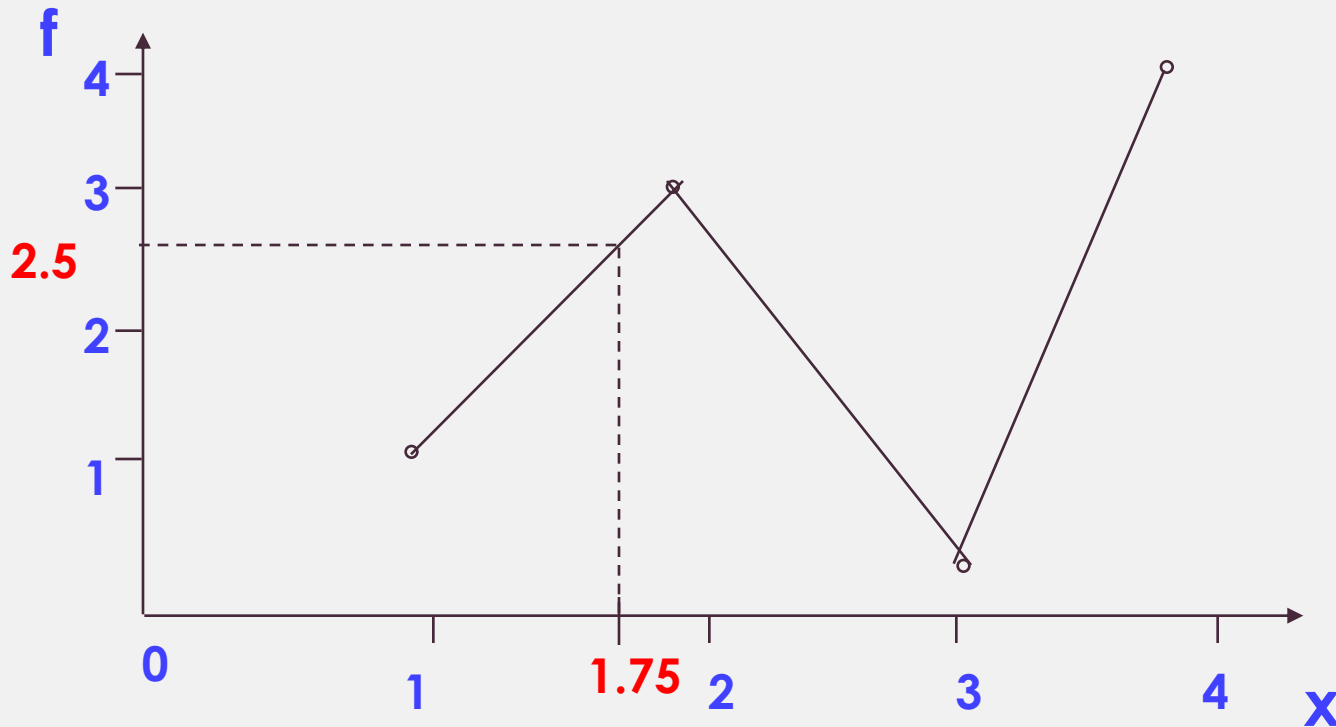
Given  $(x_1, f_1)$ ,  $(x_2, f_2)$ ,  $(x_3, f_3)$ ,  $(x_4, f_4)$  - estimate the value of  $f$  at other values of  $x$  - say,  $x^*$ . Suppose  $x^*=1.75$

# Nearest Neighbour



Take  $f$ -value at  $x^*$  as  $f$ -value of nearest data sample.  
So if  $x^* = 1.75$ , then  $f$  estimated as 3

# Linear Interpolation



Join data points with straight lines- read off f-value corresponding to  $x^*$ .. in the case that  $x^*=1.75$ , then f estimated as 2.5

# Linear Interpolation - Doing the Calculation

Suppose  $x^*$  lies between  $x_1$  and  $x_2$ . Then apply the transformation:

$$t = (x^* - x_1) / (x_2 - x_1)$$

$$t = (1.75 - 1) / (2 - 1) = 0.75$$

so that  $t$  goes from 0 to 1.

$$f(x^*) = (1 - t) f_1 + t f_2$$

$$f(1.75) = 0.25 * 1 + 0.75 * 3 \\ = 2.5$$

The functions  $j(t) = 1 - t$  and  $k(t) = t$  are *basis functions*.

OR, saving a multiplication:

$$f(x^*) = f_1 + t (f_2 - f_1)$$

$$f(1.75) = 1 + 0.75 * (3 - 1) \\ = 2.5$$

# Nearest Neighbour and Linear Interpolation

## ■ Nearest Neighbour

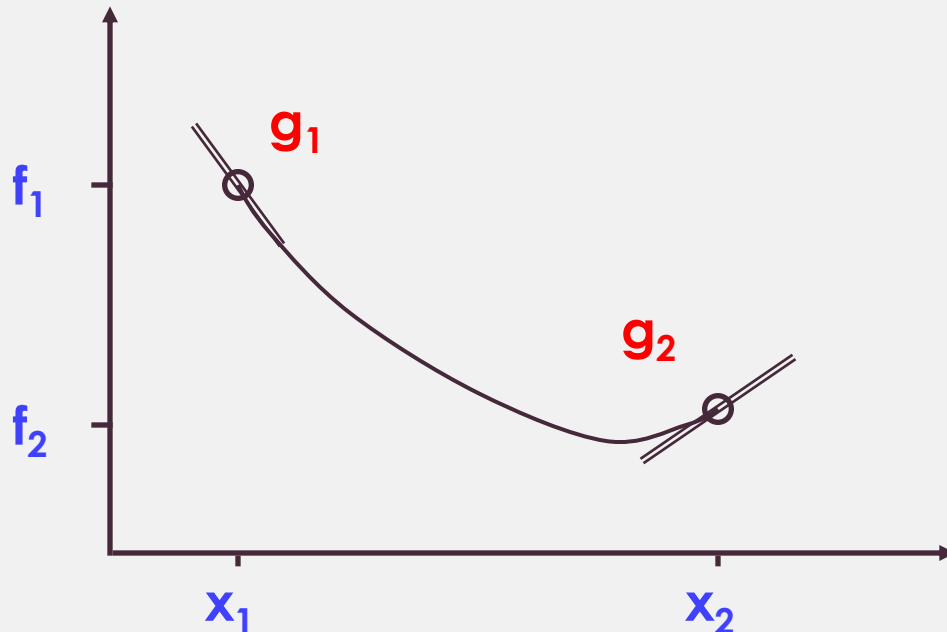
- Very fast : no arithmetic involved
- Continuity : discontinuous value
- Bounds : bounds fixed at data extremes

## ■ Linear Interpolation

- Fast : one multiply, one divide
- Continuity : value only continuous, not slope ( $C^0$ )
- Bounds : bounds fixed at data extremes

# Drawing a Smooth Curve

- Rather than straight line between points, we create a curve piece

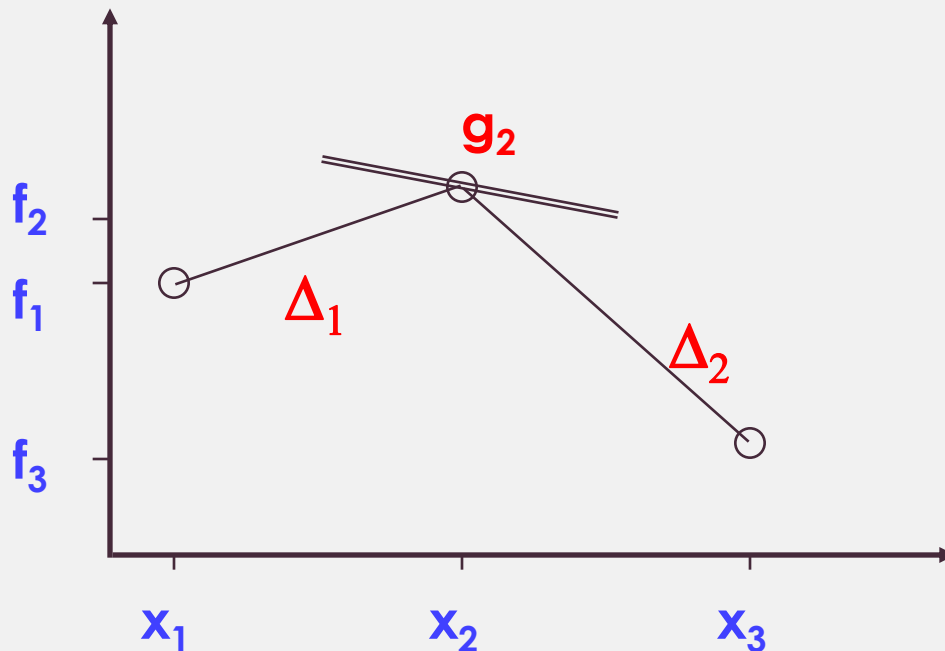


We estimate the slopes  $g_1$  and  $g_2$  at the data points, and construct curve which has these values and these slopes at end-points



# Slope Estimation

- Slopes estimated as some average of the slopes of adjacent chords - eg to estimate slope at  $x_2$

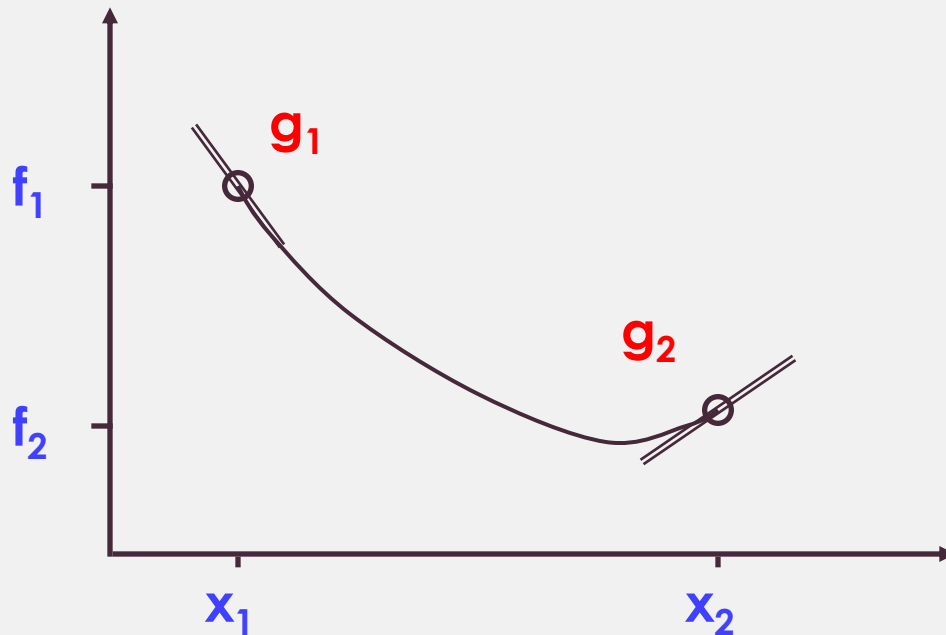


$g_2$  usually  
arithmetic mean  
(ie average) of  $\Delta_1, \Delta_2$

$$\Delta_1 = (f_2 - f_1) / (x_2 - x_1)$$

# Piecewise Cubic Interpolation

Once the slopes at  $x_1$  and  $x_2$  are known, this is sufficient to define a unique cubic polynomial in the interval  $[x_1, x_2]$



$$\begin{aligned} f(x) = & c_1(x) * f_1 \\ & + c_2(x) * f_2 \\ & + h * (d_1(x) * g_1 \\ & - d_2(x) * g_2) \end{aligned}$$

$c_i(x)$ ,  $d_i(x)$  are  
cubic Hermite  
basis functions,  
 $h = x_2 - x_1$ .

# Cubic Hermite Basis Functions

Here they are:

Again set  $t = (x - x_1)/(x_2 - x_1)$

$$c_1(t) = 3(1-t)^2 - 2(1-t)^3$$

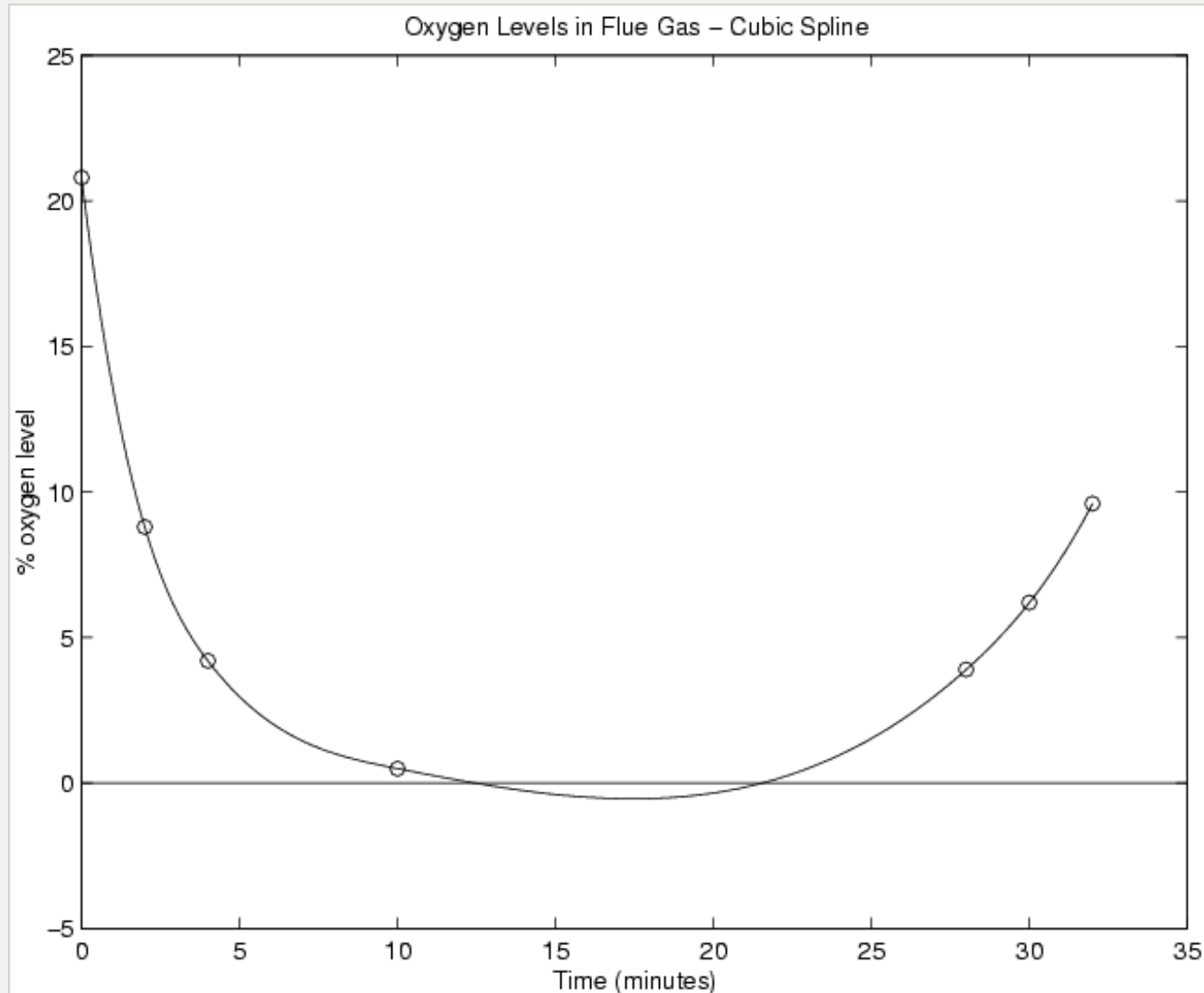
$$c_2(t) = 3t^2 - 2t^3$$

$$d_1(t) = (1-t)^2 - (1-t)^3$$

$$d_2(t) = t^2 - t^3$$

Check the values  
at  $x = x_1, x_2$  (ie  $t=0,1$ )

# Coal data - cubic interpolation



# Piecewise Cubic Interpolation

- More computation needed than with nearest neighbour or linear interpolation.
- Continuity: slope continuity ( $C^1$ ) by construction - and cubic splines will give second derivative continuity ( $C^2$ )
- Bounds: bounds not controlled generally - eg if arithmetic mean used in slope estimation...

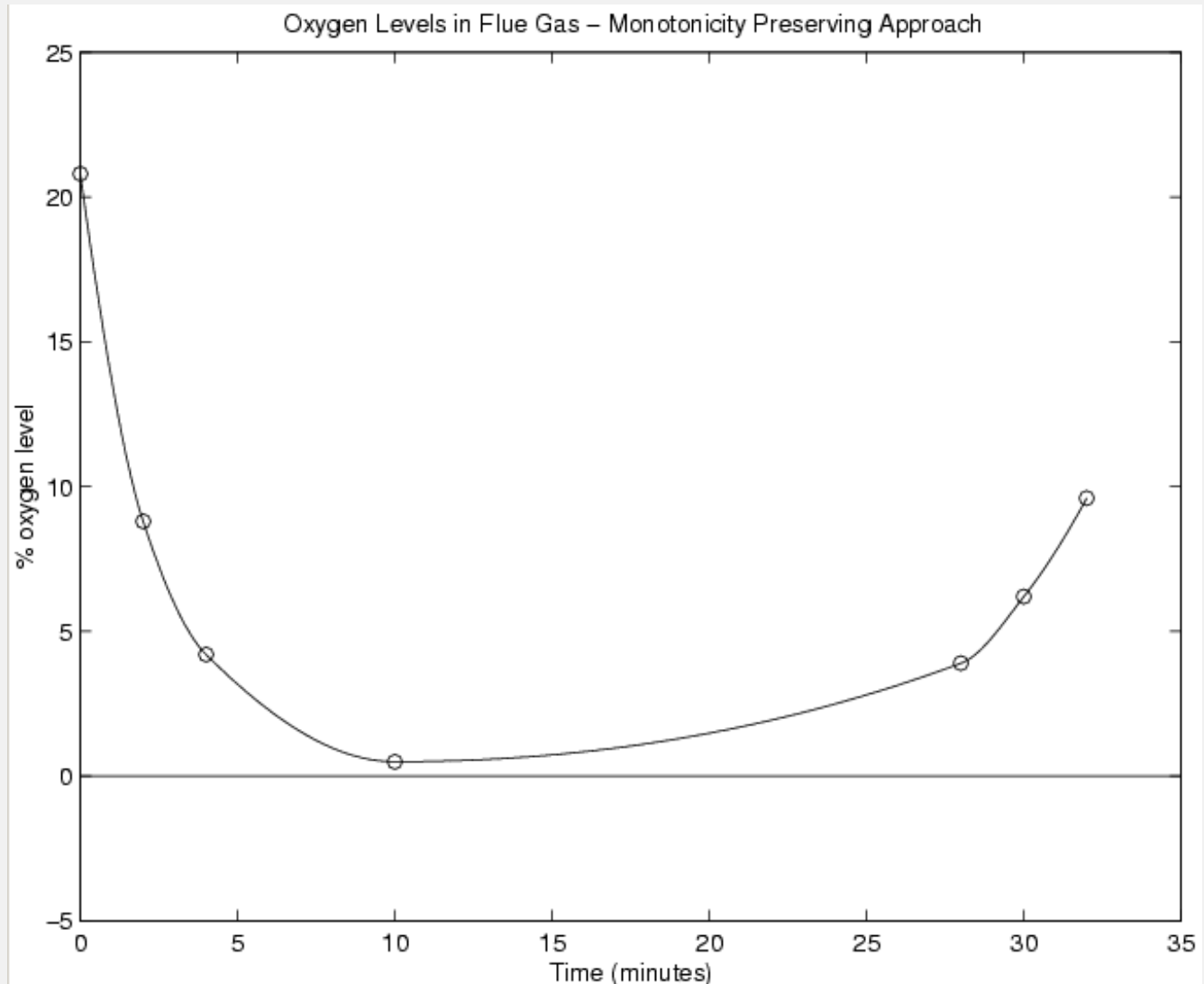
# Shape Control

- However special choices for slope estimation do give control over shape
- If the harmonic mean is used

$$1/g_2 = 0.5 ( 1/\Delta_1 + 1/\Delta_2 )$$

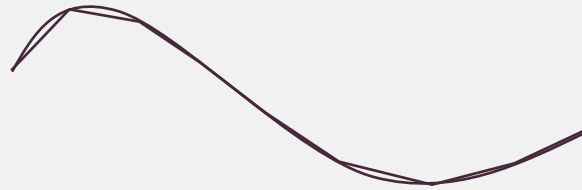
then we find that  $f(x)$  lies within the bounds of the data

# Coal data – keeping within the bounds of the data



# Rendering Line Graphs

- The final rendering step is straightforward
- We can assume that the underlying graphics system will be able to draw **straight line segments**
- Thus the linear interpolation case is trivial
- For curves, we do an approximation as sequence of small line segments





# Background Study

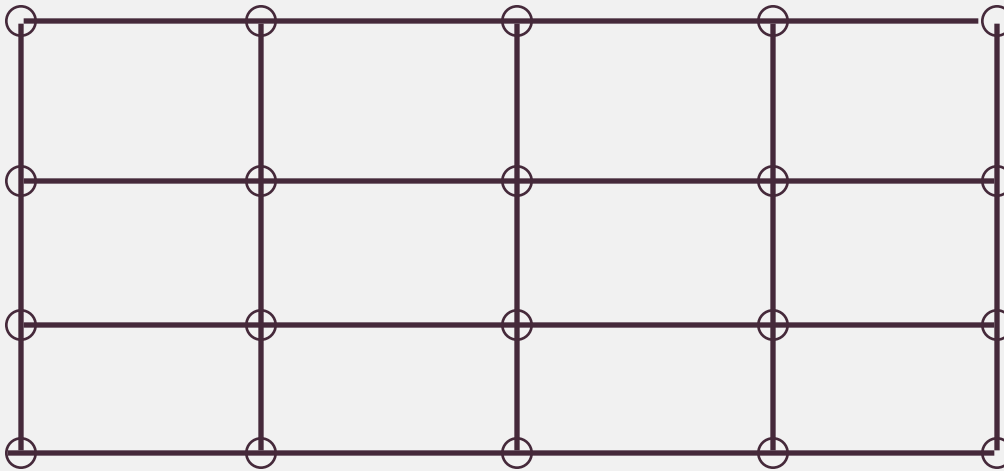
- Take the coal furnace data from lecture 2
  - Investigate how to present this as a graph in **Excel** (not easy!)
  - After learning **gnuplot** in the practical class, create a graph of the coal data using **gnuplot**
- Look for **Java applets** on the Web that will create line graphs

# **Visualization Techniques**

## **Two Dimensional Scalar Data**

# 2D Interpolation - Rectangular Grid

- Suppose we are given data on rectangular grid:



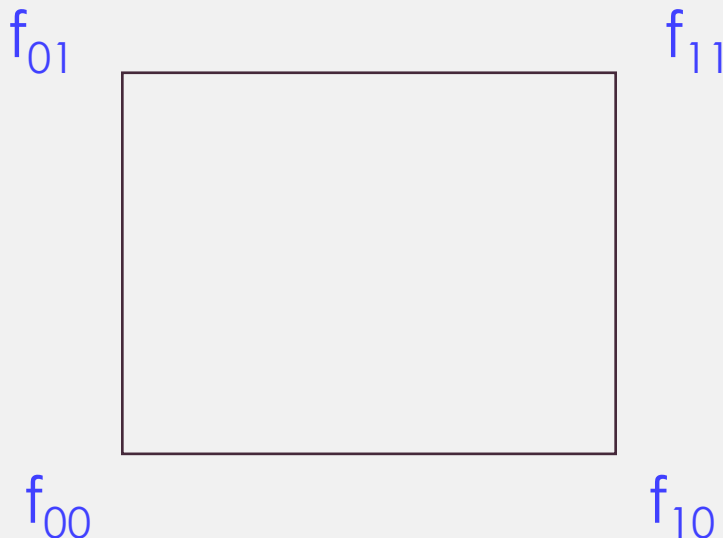
$f$  given at each grid point;  
data enrichment fills out the empty spaces by interpolating values within each cell

# Nearest Neighbour Interpolation

- Straightforward extension from 1D:  
take  $f$ -value from nearest data sample
- No continuity
- Bounds fixed at data extremes

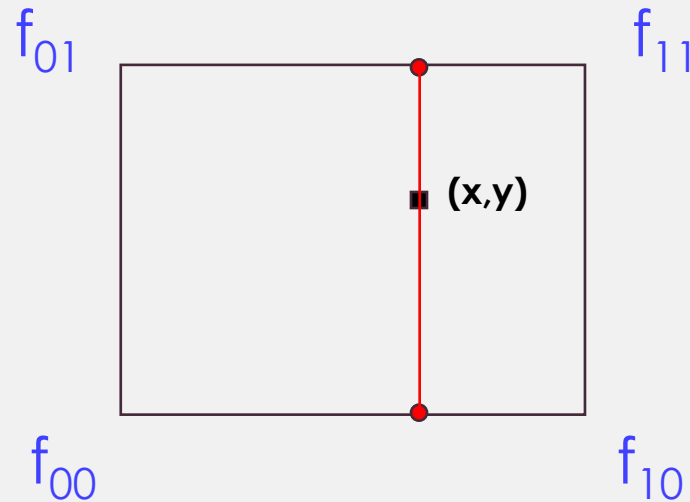
# Bilinear Interpolation

- Consider one grid rectangle:
  - suppose corners are at  $(0,0)$ ,  $(1,0)$ ,  $(1,1)$ ,  $(0,1)$  ... ie a unit square
  - values at corners are  $f_{00}$ ,  $f_{10}$ ,  $f_{11}$ ,  $f_{01}$



How do we estimate value at a point  $(x,y)$  inside the square?

# Bilinear Interpolation



We carry out three 1D interpolations:

- (i) interpolate in x-direction between  $f_{00}, f_{10}$ ; and  $f_{01}, f_{11}$
- (ii) interpolate in y-direction

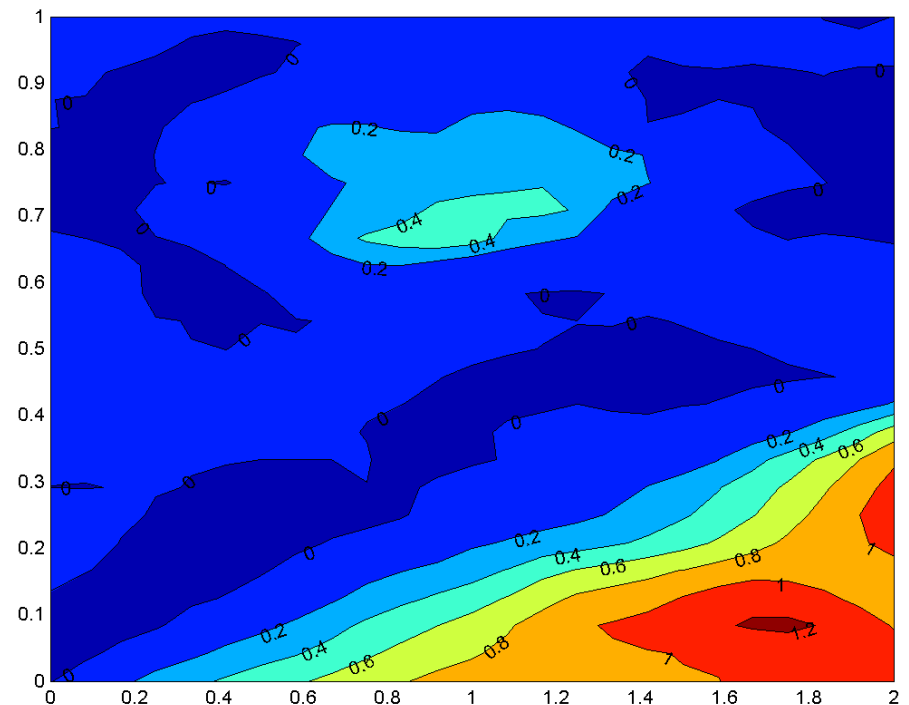
**Exercise: Show this is equivalent to calculating -**  
$$f(x, y) = (1-x)(1-y)f_{00} + x(1-y)f_{10} + (1-x)yf_{01} + xyf_{11}$$

# Piecewise Bilinear Interpolation

- Apply within each grid rectangle
- Fast
- Continuity of value, not slope ( $C^0$ )
- Bounds fixed at data extremes

# Contour Drawing

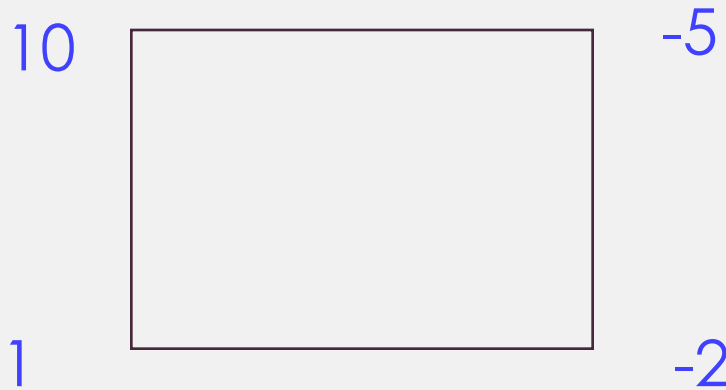
- Contouring is very common technique for 2D scalar data
- Isolines join points of equal value
  - sometimes with shading added
- How can we quickly and accurately draw these isolines?





# An Example

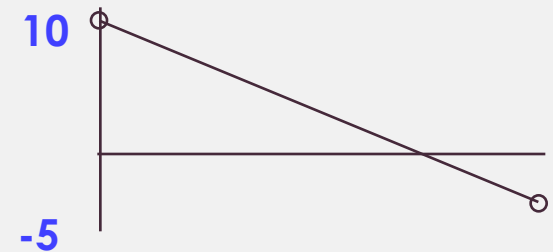
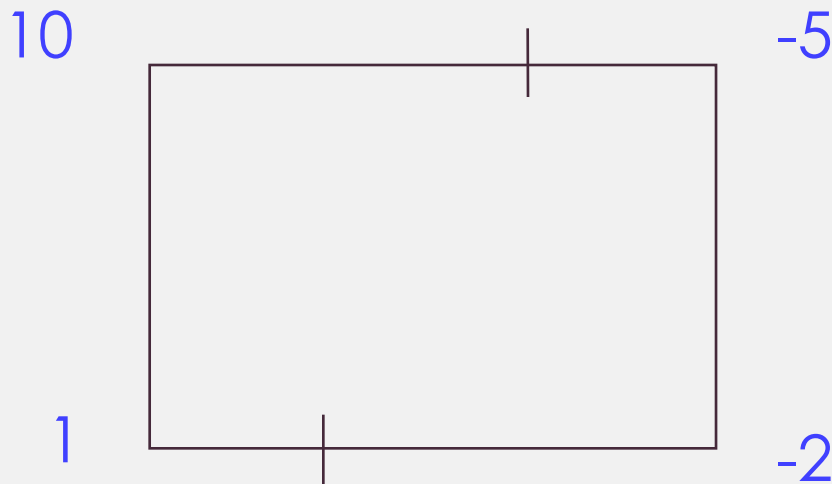
- As an example, consider this data:



Where does the zero level contour go?

# Intersections with sides

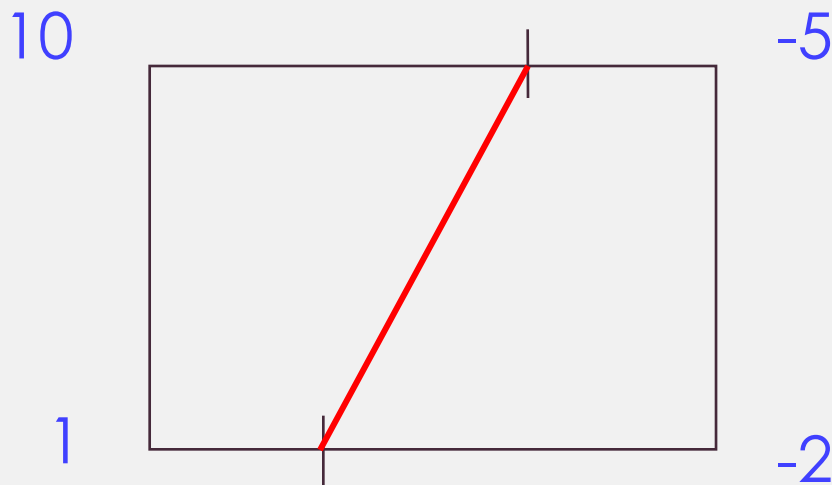
- The bilinear interpolant is linear along any edge - thus we can predict where the contour will cut the edges (just by simple proportions)



*cross-section view  
along top edge*

# Simple Approach

- A simple approach to get the contour inside the grid rectangle is just to join up the intersection points



**Question:**

Does this always work?

Try an example where one pair of opposite corners are positive, other pair negative