



Suez University

Faculty of Petroleum and Mining Engineering

Petroleum Exploration and Production Engineering Program



# Data Regression

Lecture 9 – Monday April 10, 2017

# Outline

- Data Regression
- Matlab Interpolation and Curve Fitting
- Example

# Outline

- **Data Regression**
- Matlab Interpolation and Curve Fitting
- Example

# Data Regression

Regression analysis is a statistical process for **estimating the relationships** among variables.

Regression models involve the following variables:

- The **independent variables**,  $X$ .
- The **dependent variable**,  $Y$ .
- The **unknown parameters**, denoted as  $\beta$ , which may represent a scalar or a vector.

A **regression model** relates  $Y$  to a function of  $X$  and  $\beta$ .

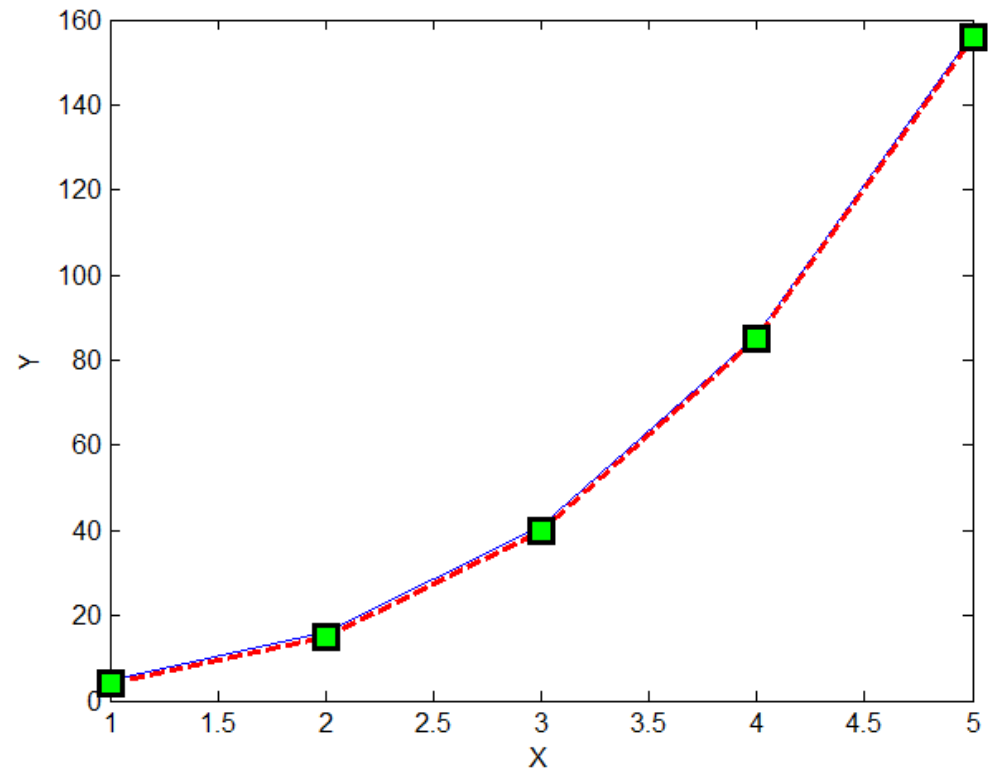
$$Y \approx f(X, \beta)$$

# Data Regression

- In the curve-fitting problem, we would like to **fit a polynomial** to a given set of data points.
- Given the **set of data points** in the shown table and assuming we want to fit a **3<sup>rd</sup> degree polynomial** to these data points.

$$y = ax^3 + bx^2 + cx + d$$

$x$	$y$
1	5
2	16
3	41
4	86
5	157



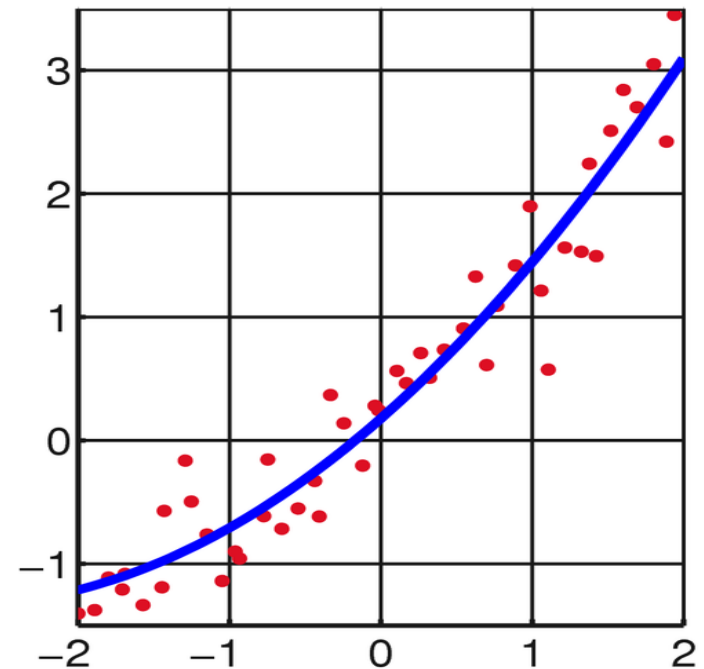
# Data Regression

Least squares of errors

$$\min f = \min \sum_{i=1}^{\text{\# of points}} (y - y_{desired})^2$$

**Note:** In curve-fitting, the best fit in the **least-squares** sense minimizes the sum of squared residuals, a residual being the difference between an observed value and the fitted value provided by a model.

Source: Wikipedia

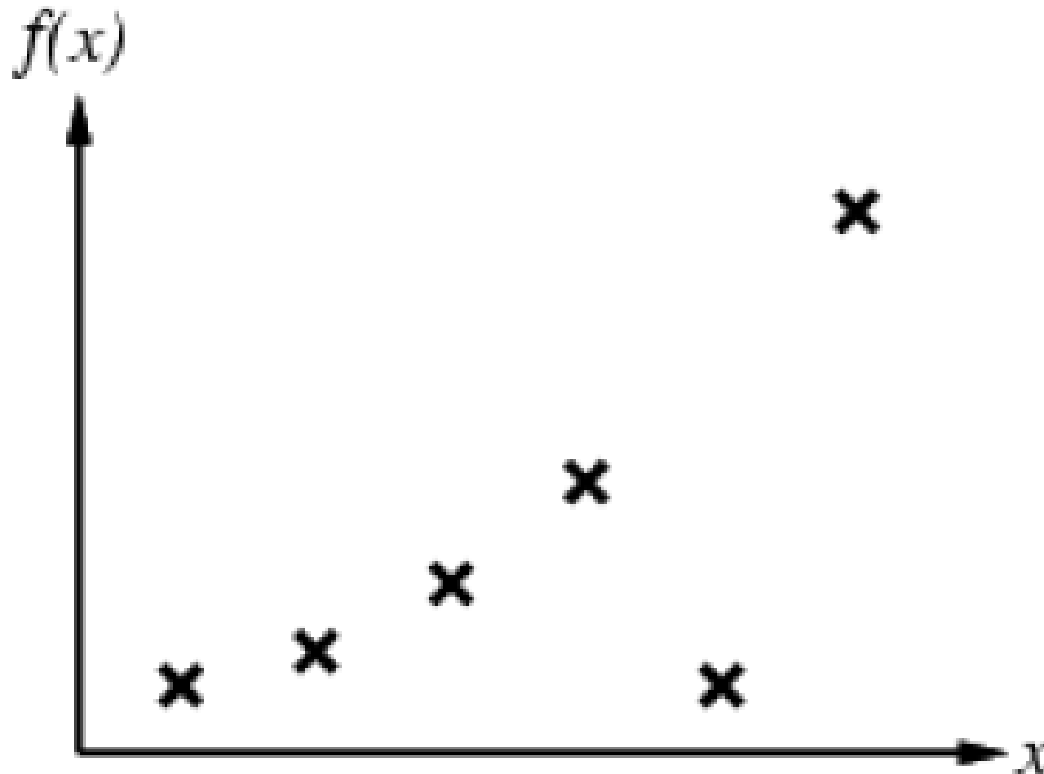


# Data Regression

- **Curve fitting (regression)**

**Given:**  $x$  = Input data point (a training example)

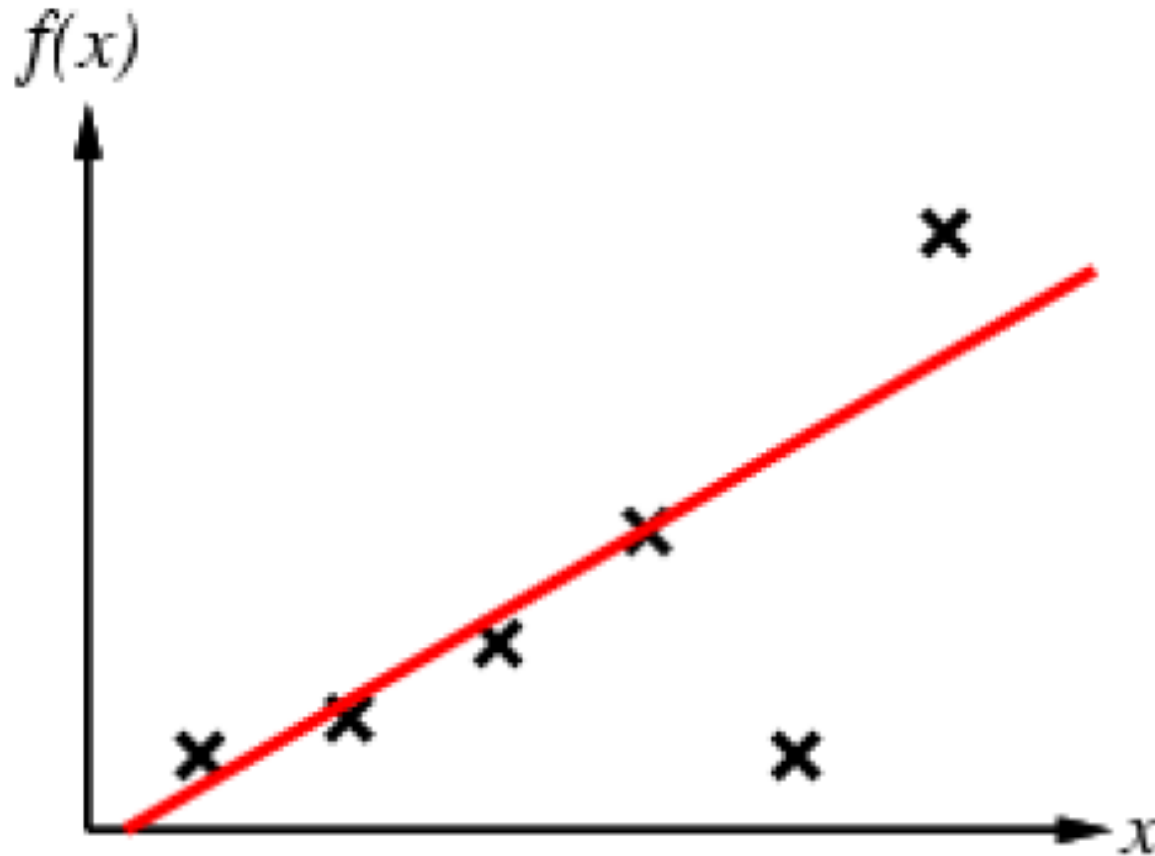
**Required:**  $y \approx f(x)$



# Data Regression

- Curve fitting (regression)

$y =$  Straight line?

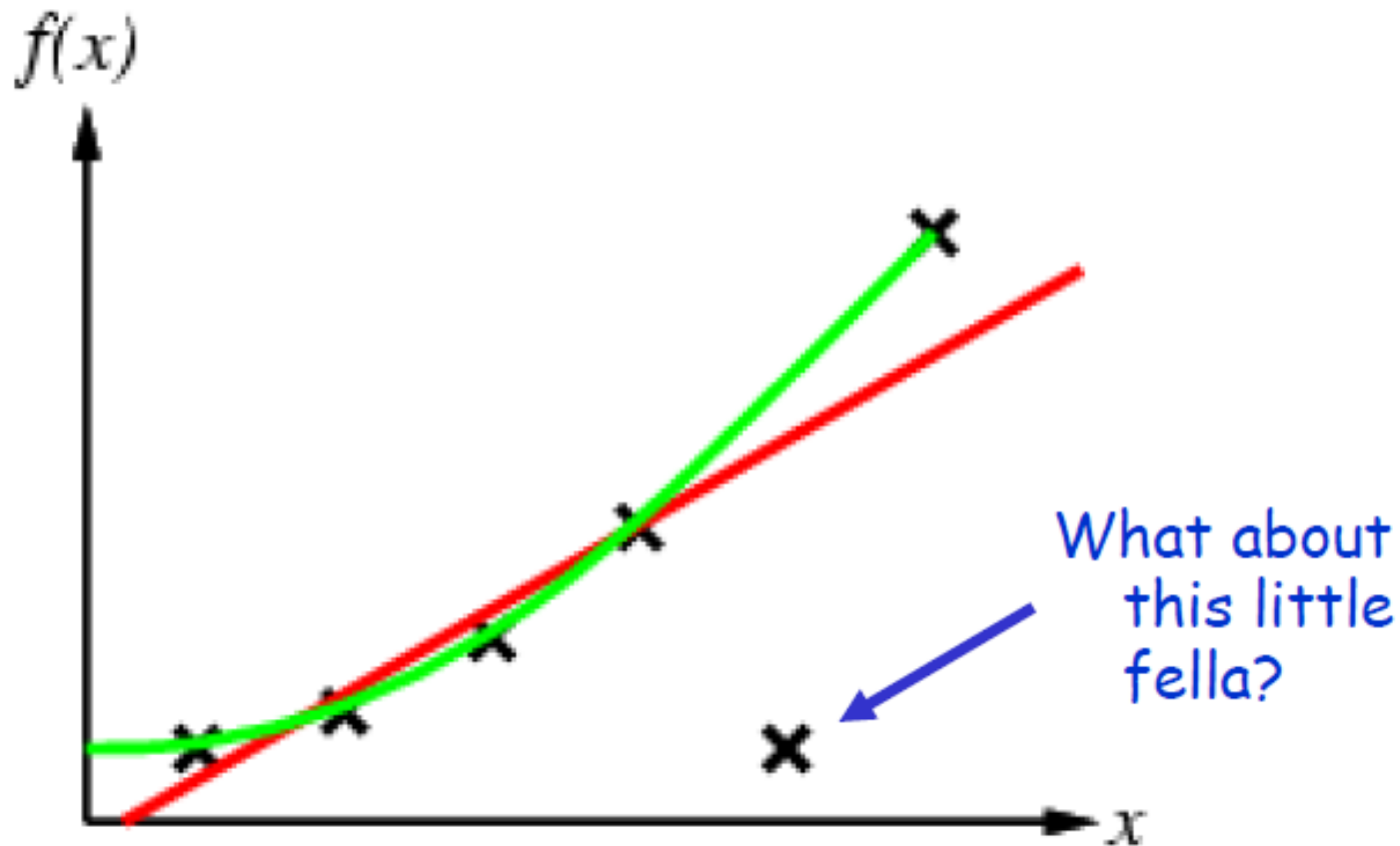




# Data Regression

- Curve fitting (regression)

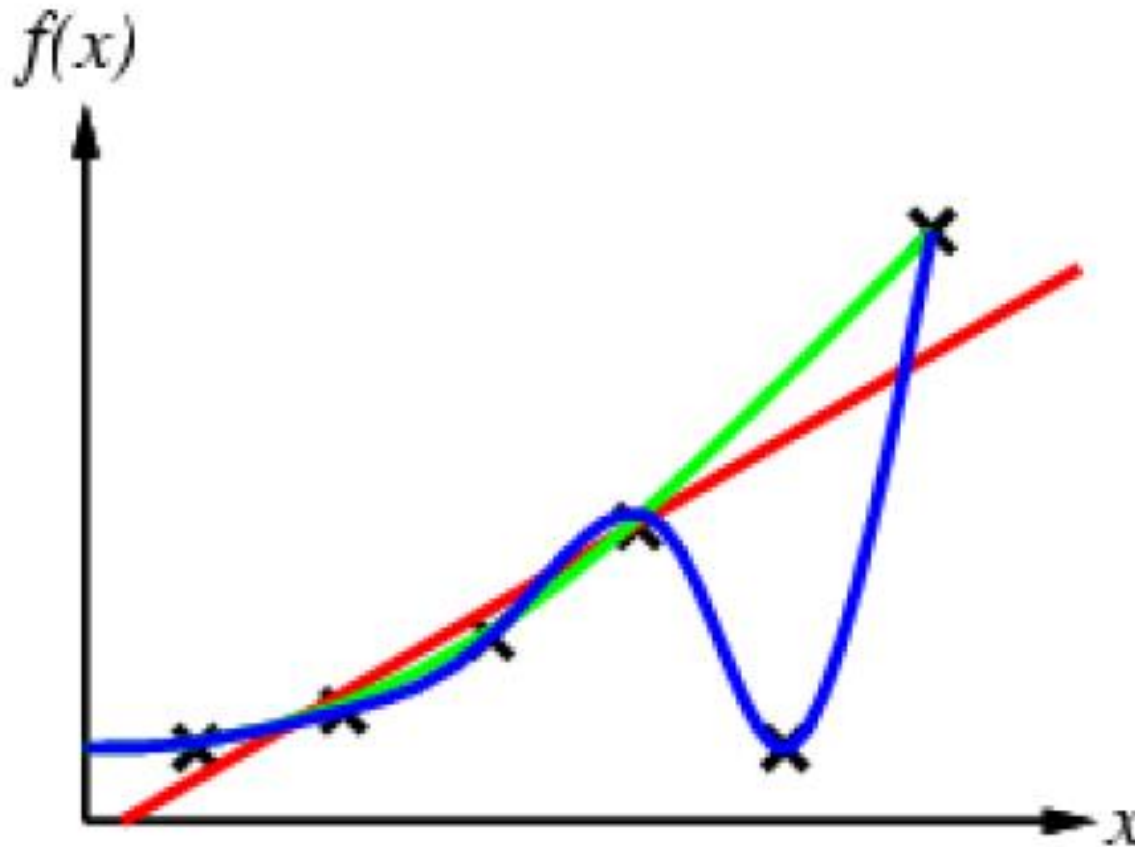
$y = \text{quadratic function?}$



# Data Regression

- Curve fitting (regression)

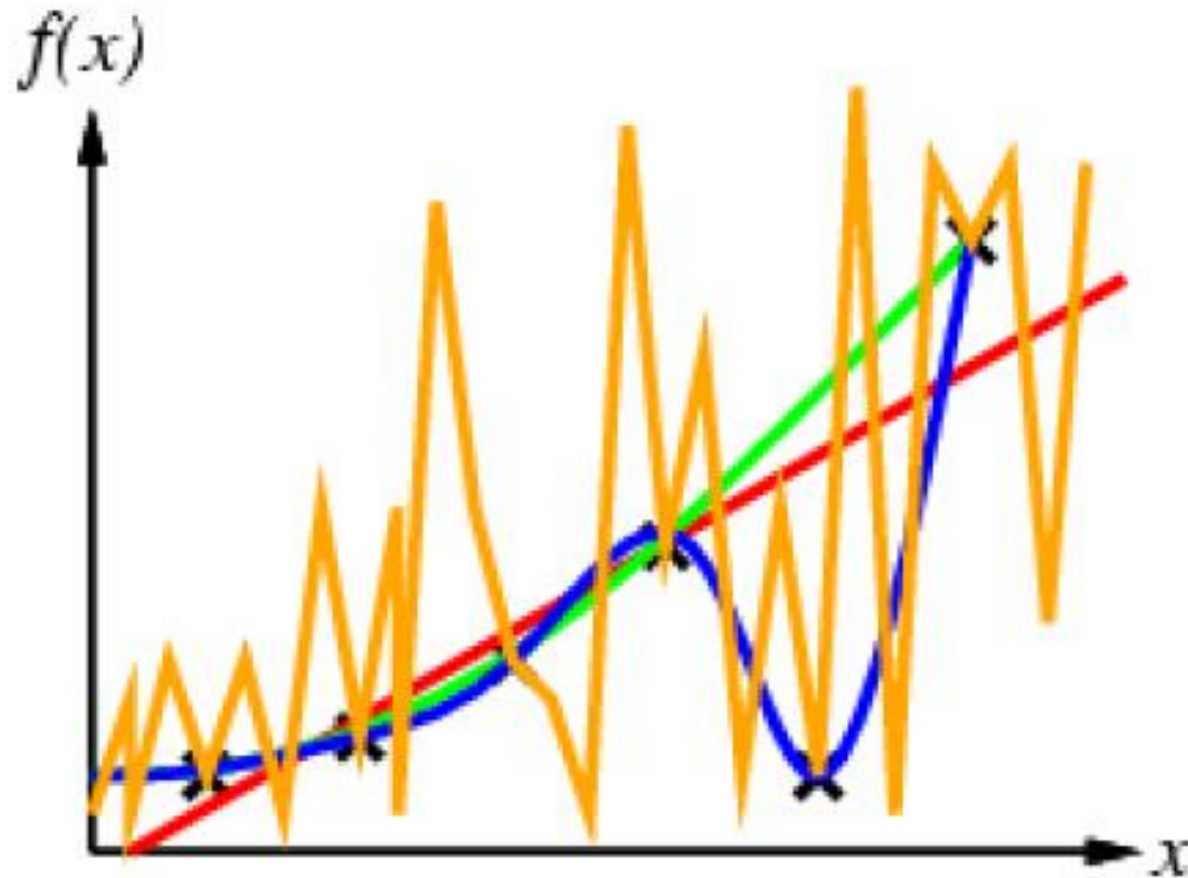
What about a function that satisfies all!



# Data Regression

- Curve fitting (regression)

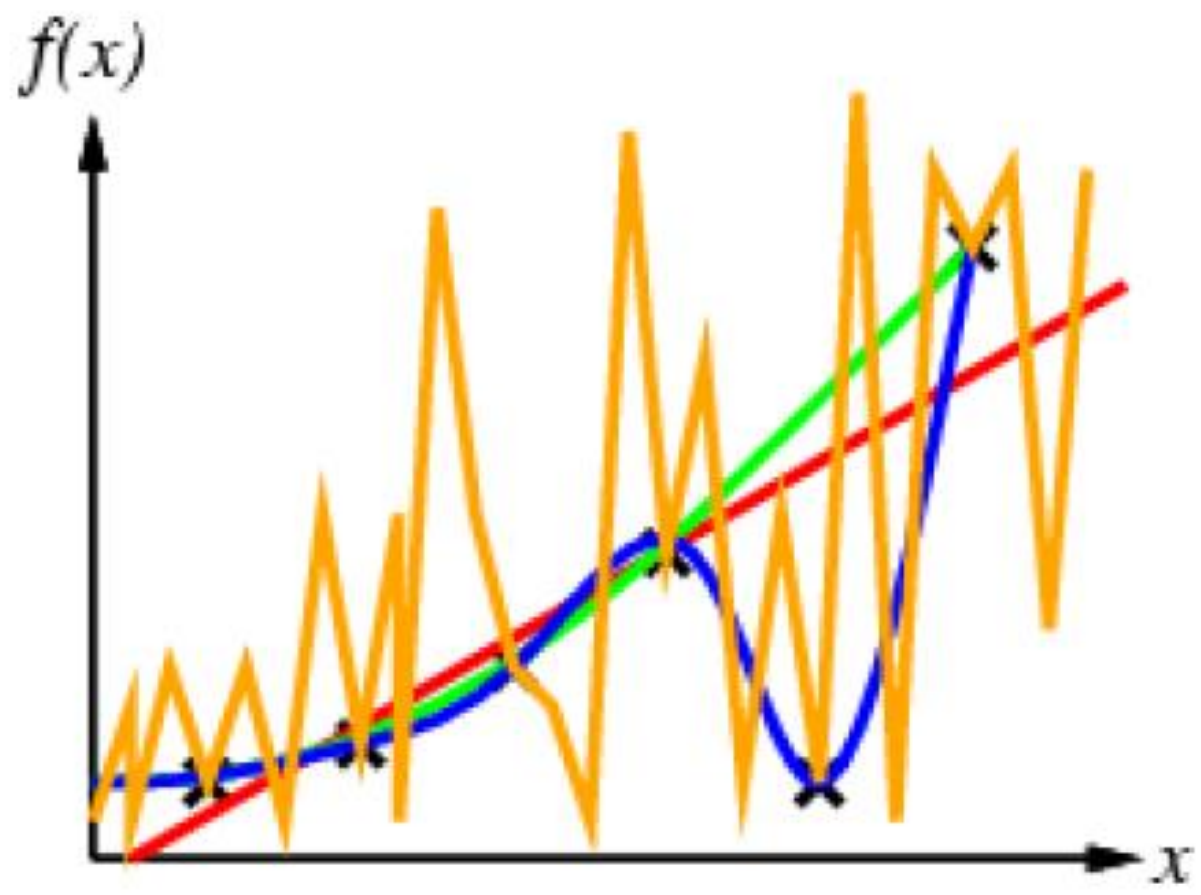
But so does this one...



# Data Regression

- Curve fitting (regression)

But so does this one...

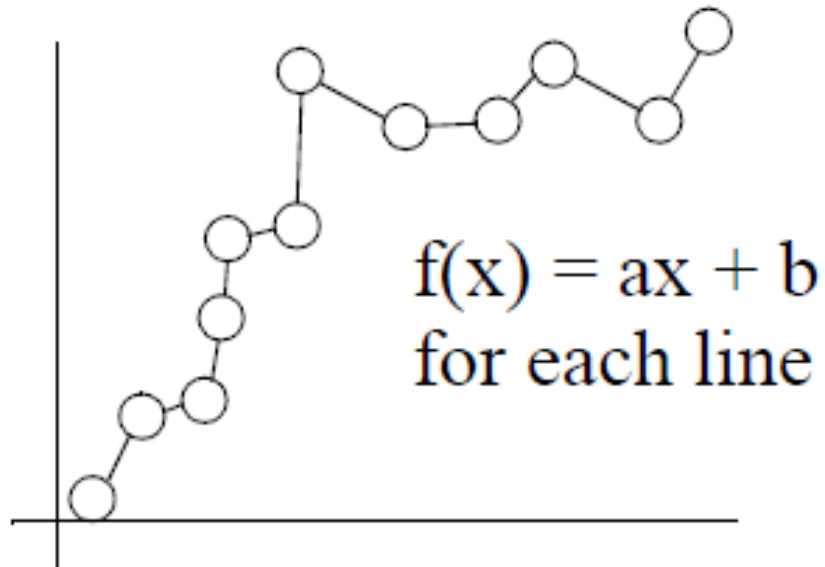


# Outline

- Data Regression
- **Matlab Interpolation and Curve Fitting**
- Example

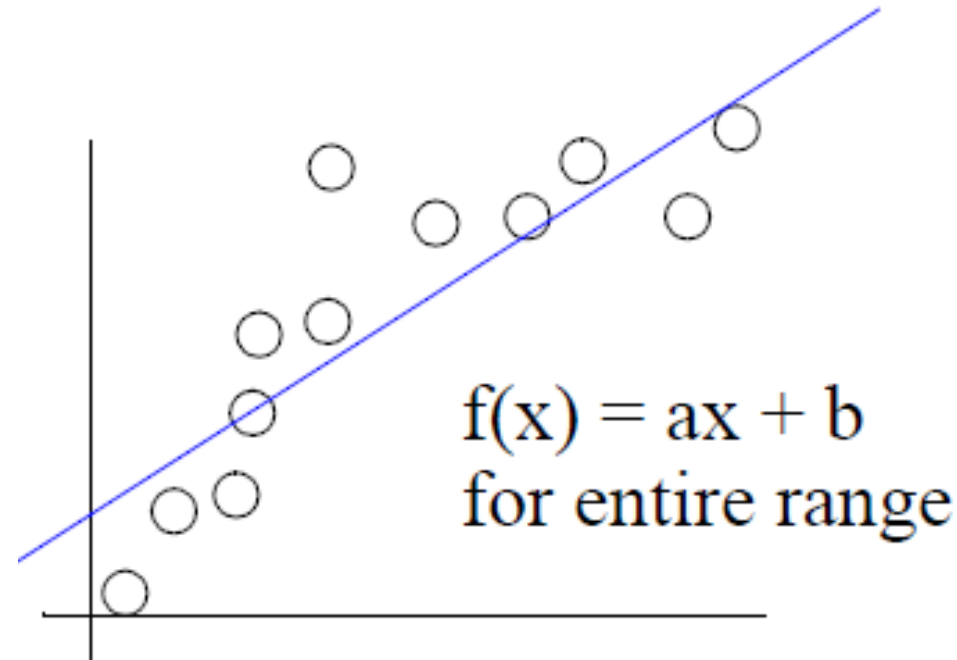
# Matlab Interpolation and Curve Fitting

- Interpolation and Curve fitting



Interpolation

If data is reliable, we can plot it and connect the dots This is piece-wise, linear interpolation

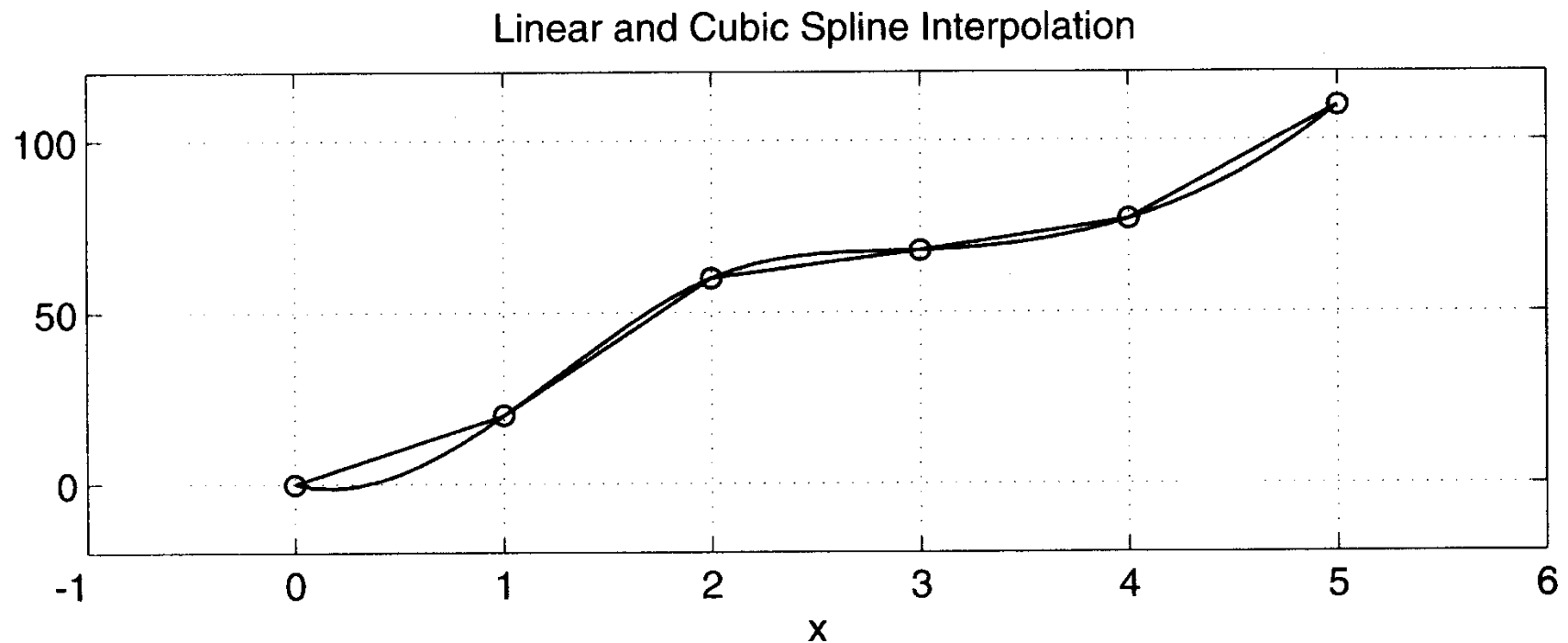


Curve Fitting

Capturing the trend in the data by assigning a single function across the entire range

# Matlab Interpolation and Curve Fitting

We present two types of interpolation- linear interpolation and cubic-spline interpolation.



# Matlab Interpolation and Curve Fitting

- **Linear Interpolation**

One of the most common techniques for estimating data between two given data points is linear interpolation.

## **interp1(x,y,x\_new)**

Returns a vector of the size of y, which contains the interpolated y values that correspond to x\_new using linear interpolation.

## **interp1(x,y,x\_new, 'linear')**

Returns a vector of the size of y, which contains the interpolated y values that correspond to x\_new using linear interpolation.



# Matlab Interpolation and Curve Fitting

- **Linear Interpolation**

*Example:* Given the following temperature measurements taken from the cylinder head in a new engine that is being tested for possible use in a race car.

Times, s	Temperature, F
0	0
1	20
2	60
3	68
4	77
5	110

# Matlab Interpolation and Curve Fitting

## • Linear Interpolation

```
x=0:5;
```

```
y=[0,20,60,68,77,110];
```

```
y1=interp1(x,y,2.6);
```

```
y2=interp1(x,y,4.9);
```

Times, s

Temperature, F

0

0

1

20

2

60

3

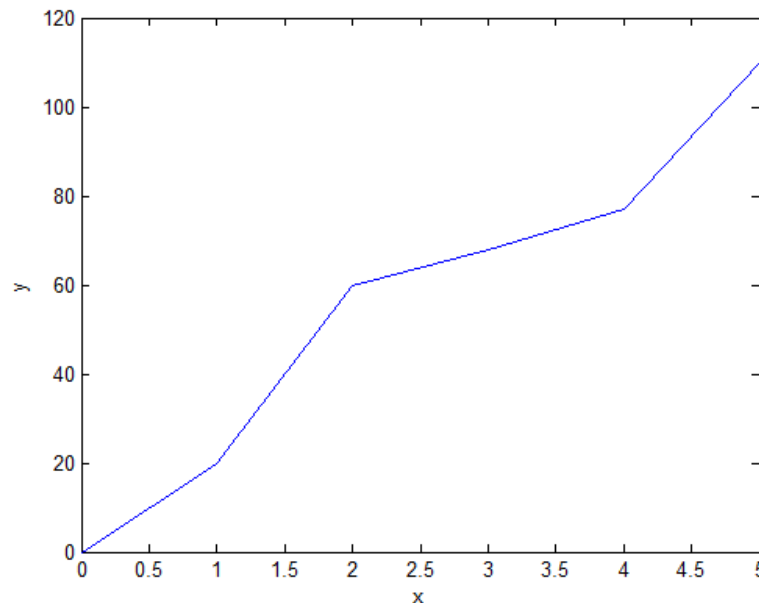
68

4

77

5

110



# Matlab Interpolation and Curve Fitting

## • Cubic-spline Interpolation

A cubic-spline is a smooth curve constructed to go through a set of points.

`interp1(x,y,x_new,'spline')`

Returns a vector which contains the interpolated y values that correspond to x\_new using cubic-spline interpolation.

**Example:** `x=0:5;`

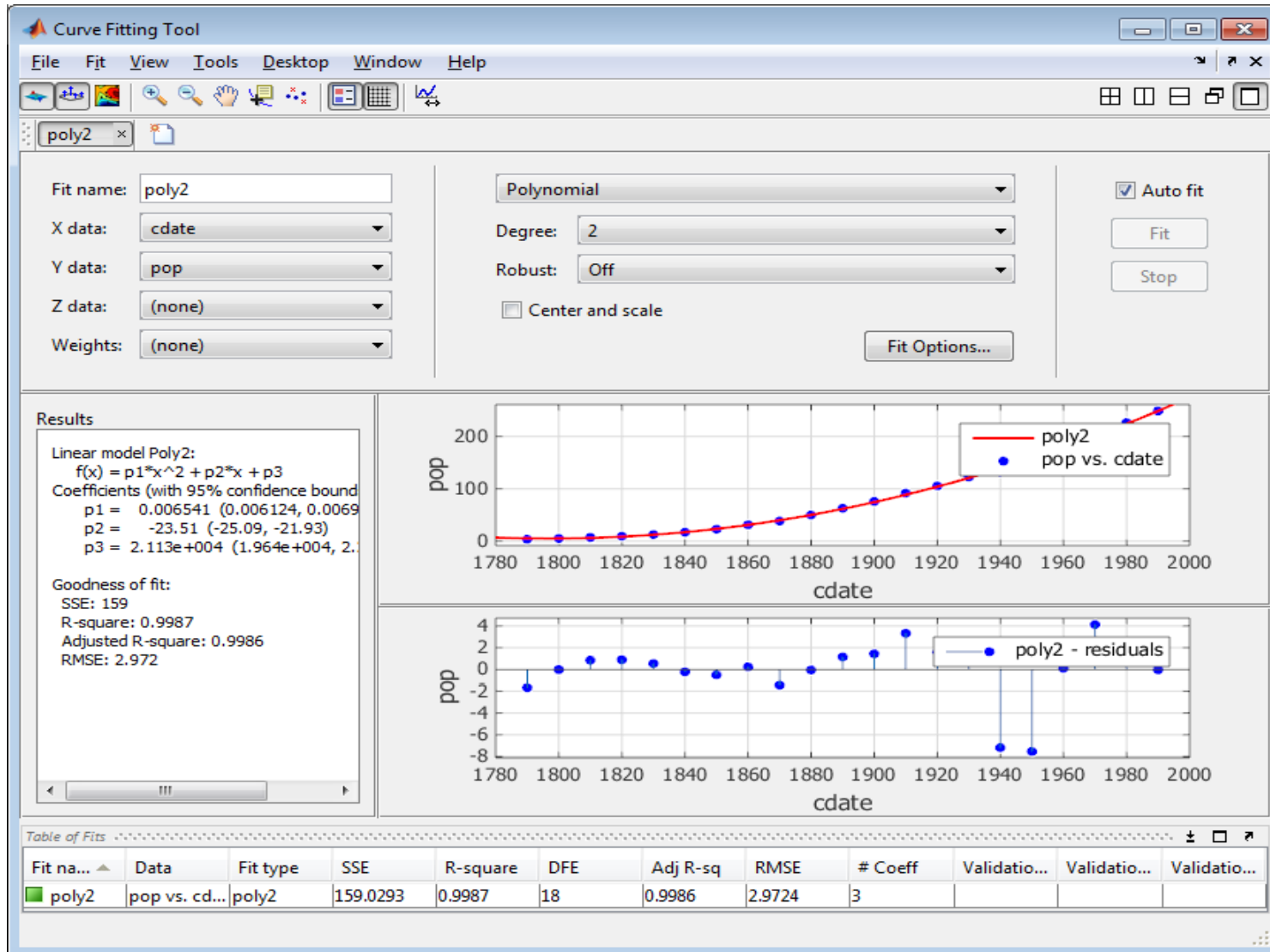
`y=[0,20,60,68,77,110];`

`temp1=interp1(x,y,2.6,'spline');`

Try this: `temp2=interp1(x,y,[2.6,4.9],'spline');`

# Matlab Interpolation and Curve Fitting

- Curve Fitting Tool



# Matlab Interpolation and Curve Fitting

- **Curve Fitting Tool**

**Curve Fitting Toolbox** software allows you to work in two different environments:

- An interactive environment, with the Curve Fitting app and the Spline Tool
- A programmatic environment that allows you to write object-oriented MATLAB code using curve and surface fitting methods.

# Matlab Interpolation and Curve Fitting

## • Curve Fitting Tool

`cftool` opens Curve Fitting app or brings focus to the app if it is already open.

`cftool( x, y )` creates a curve fit to x input and y output. x and y must be numeric, have two or more elements, and have the same number of elements.

`cftool( x, y, z )` creates a surface fit to x and y inputs and z output.

`cftool( x, y, [], w )` creates a curve fit with weights w. w must be numeric and have the same number of elements as x and y.

`cftool( x, y, z, w )` creates a surface fit with weights w. w must be numeric and have the same number of elements as z

`cftool( filename )` loads the Curve Fitting session in filename into Curve Fitting app.

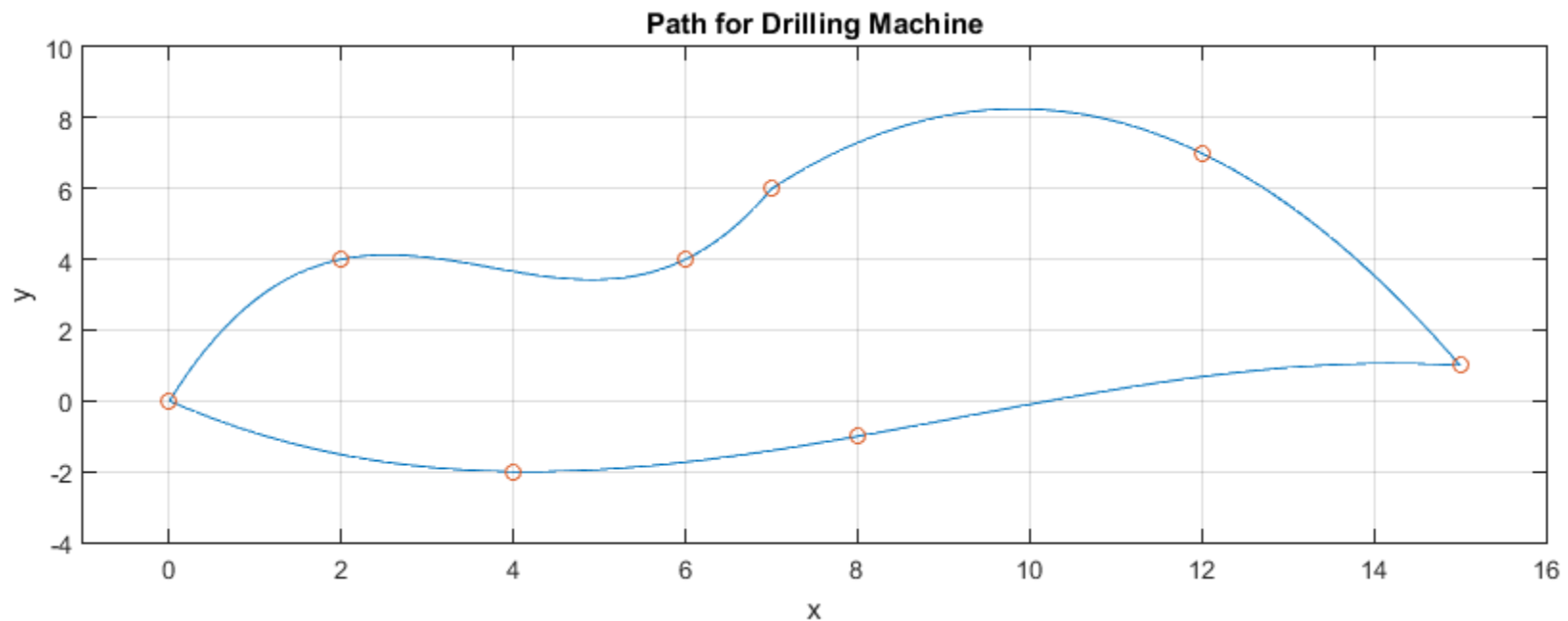
# Outline

- Data Regression
- Matlab Interpolation and Curve Fitting
- **Example**

# Example

- **Inputs/Outputs Description**

Design a smooth curve, using cubic-spline interpolation, that can be used to guide a drilling machine to several location and then back to the original position.

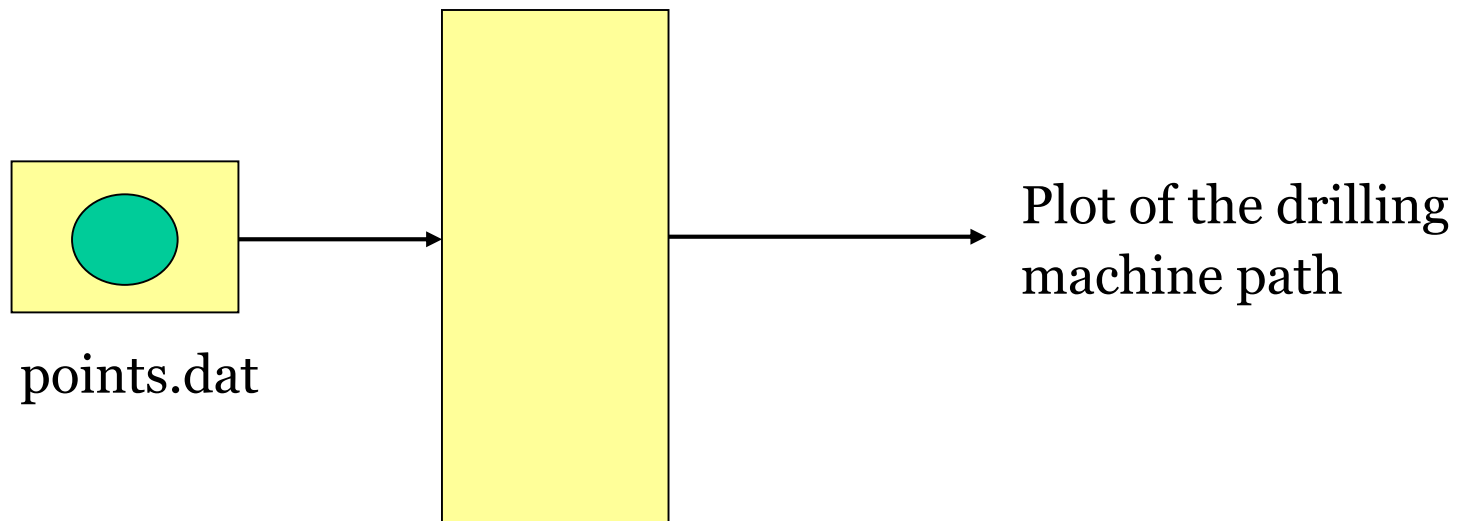




# Example

- **Inputs/Outputs Description**

The following I/O diagram shows that the input is a file containing the xy coordinates of the points over which the drilling machine must pass and its original position.



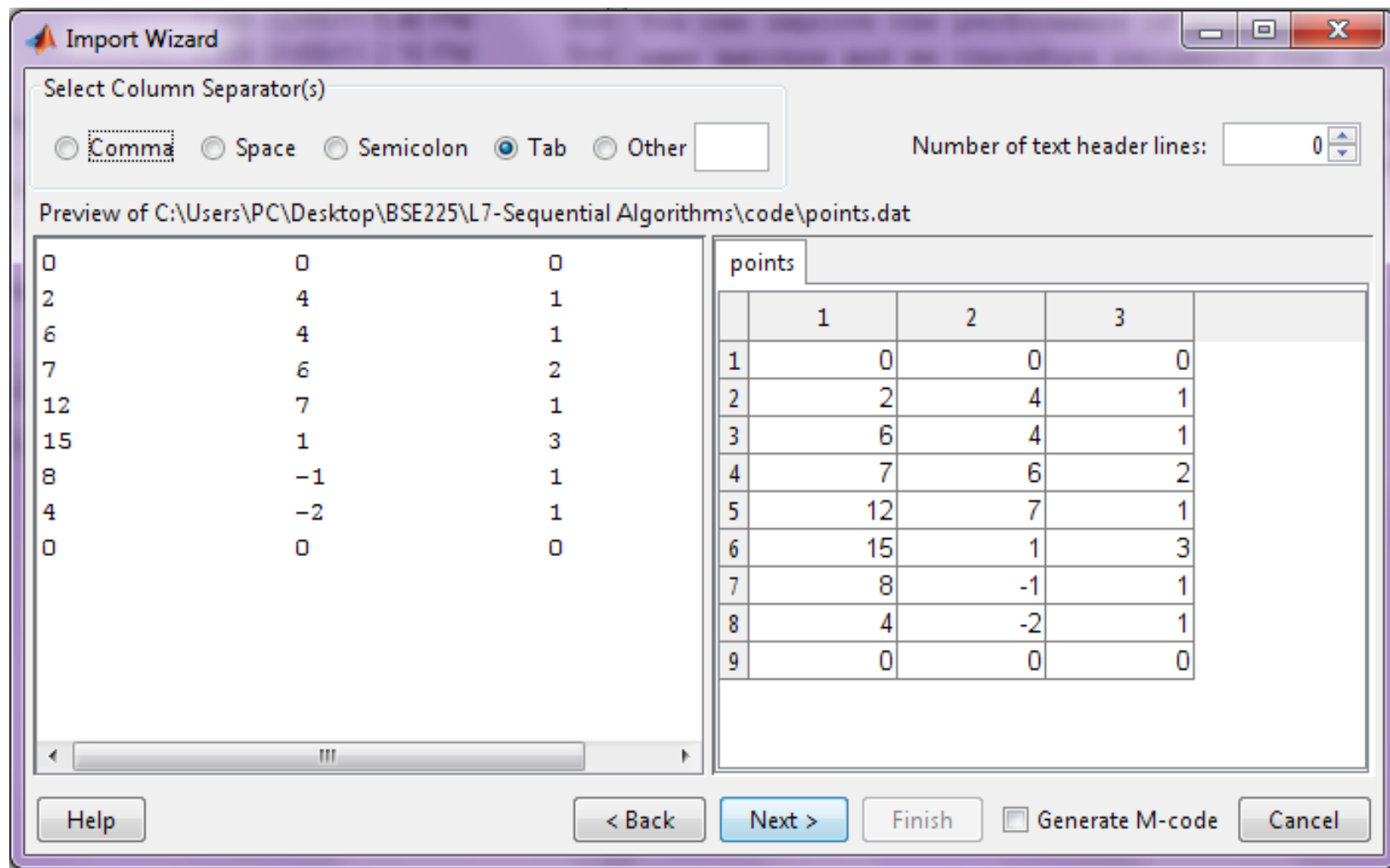
# Example

## • Inputs/Outputs Description

<b>x</b>	<b>y</b>	<b>code</b>	<b>Interpretation</b>
0	0	0	home position
2	4	1	intermediate position
6	4	1	intermediate position
7	6	2	drill
12	7	1	intermediate position
15	1	3	release
8	-1	1	intermediate position
4	-2	1	intermediate position
0	0	0	home position

# Example

- Input file points.dat



# Example

## • Matlab Program

```
% Drilling Machine path  
% read data file.  
load points.dat;  
x=points(:,1);  
y=points(:,2);  
code=points(:,3);
```

# Example

- **Matlab Program**

```
%generates the three separate paths.  
drill=find(code==2);  
release=find(code==3);  
lenx=length(x);  
x1=x(1:drill);          y1=y(1:drill);  
x2=x(drill:release);  
y2=y(drill:release);  
x3=x(release:lenx);     y3=y(release:lenx);
```

# Example

## • Matlab Program

```
% Compute time increment and corresponding  
time sequences.
```

```
incr=min(abs(x(2:lenx)-x(1:lenx-1)))/10;
```

```
t1=x(1):incr*sign(x(drill)-x(1)):x(drill);
```

```
t2=x(drill):incr*sign(x(release)-  
x(drill)):x(release);
```

```
t3=x(release):incr*sign(x(lenx)-  
x(release)):x(lenx);
```

# Example

- **Matlab Program**

```
% Compute splines  
  
s1=interp1(x1,y1,t1,'spline');  
  
s2=interp1(x2,y2,t2,'spline');  
  
s3=interp1(x3,y3,t3,'spline');
```

# Example

## • Matlab Program

```
% Plot spline path.  
plot([t1 t2 t3],[s1 s2 s3],[x1' x2' x3'],...  
[y1' y2' y3'], '0'),...  
title('Path for Drilling Machine'),...  
xlabel('x'),ylabel('y'), grid,...  
axis([-1,16,-4,10])
```



# Example

- Program Run

