

Метод на най-малките квадрати (МНМК)

Задача: (**a** и **b** са съответно предпоследната и последната цифра от факултетния номер)

1. Да се състави таблицата $(x_k, g(x_k))$, където

$$x_k = -b + k(0.1), k = \overline{0, 10}, g(x) = e^{\frac{(a+1)x}{10}}$$

Търси се апроксимацията в точката $s = -b + (0.17)a + 0.01$. За тази цел:

2. Да се построи полином на ленейна регресия по получената таблица.
3. Да се построи полином на квадратична регресия по получената таблица.
4. Да се построи полином на кубична регресия по получената таблица.
5. Да се пресметне апроксимацията, използвайки всеки един от построените полиноми (общо 3).
6. Да се оцени грешката за всяка от получените апроксимации.
7. Да се направи сравнение между трите резултата.

Генериране на данни

```
In[1]:= xt = Table[-7 + k * 0.1, {k, 0, 10}]
```

```
Out[1]= {-7., -6.9, -6.8, -6.7, -6.6, -6.5, -6.4, -6.3, -6.2, -6.1, -6.}
```

```
In[2]:= f[x_] := e^{\frac{7x}{10}}  
yt = f[xt]
```

```
Out[3]= {0.00744658, 0.00798652, 0.00856561, 0.00918669, 0.0098528,  
0.0105672, 0.0113334, 0.0121552, 0.0130365, 0.0139818, 0.0149956}
```

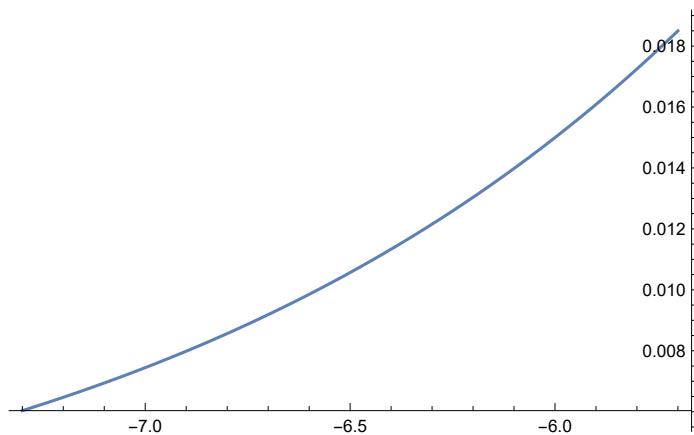
```
In[4]:= P = Length[xt]
```

```
Out[4]= 11
```

Визуализация

In[5]:= `grf = Plot[f[x], {x, xt[[1]] - 0.3, xt[[P]] + 0.3}]`

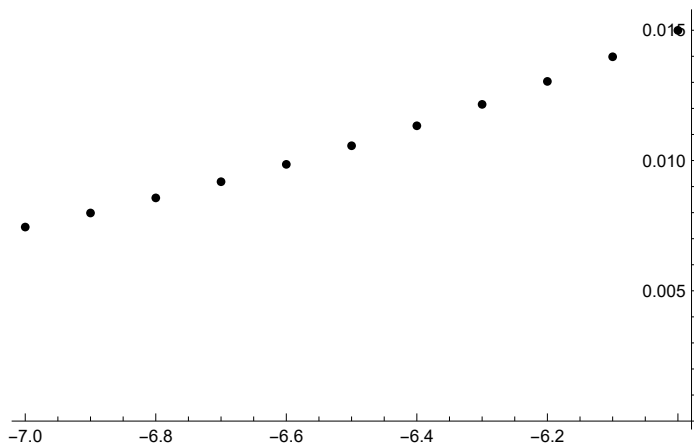
Out[5]=



In[6]:= `points = Table[{xt[[i]], yt[[i]]}, {i, 1, P}];`

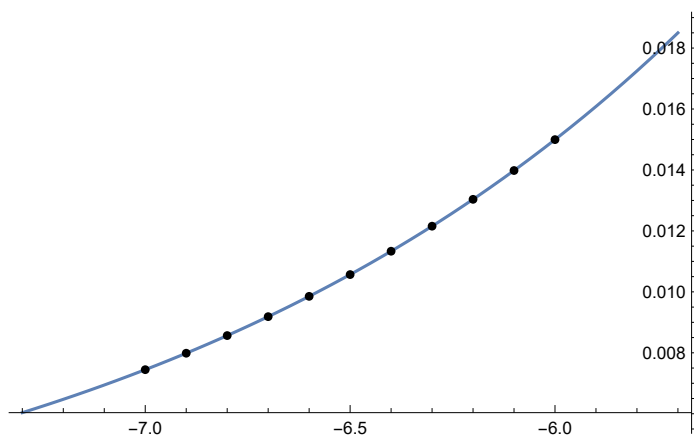
In[7]:= `grp = ListPlot[points, PlotStyle -> Black]`

Out[7]=



In[8]:= `Show[grf, grp]`

Out[8]=



Линейна регресия

Попълваме таблицата

In[9]:= $\mathbf{x}t^2$

Out[9]= {49., 47.61, 46.24, 44.89, 43.56, 42.25, 40.96, 39.69, 38.44, 37.21, 36.}

In[10]:= $\mathbf{y}t * \mathbf{x}t$

Out[10]= {-0.0521261, -0.055107, -0.0582461, -0.0615508, -0.0650285,
-0.0686868, -0.0725338, -0.0765776, -0.0808265, -0.0852889, -0.0899735}

Намиране на сумите

In[11]:= $\sum_{i=1}^P \mathbf{x}t[[i]]$

Out[11]= -71.5

In[12]:= $\sum_{i=1}^P \mathbf{y}t[[i]]$

Out[12]= 0.119108

In[13]:= $\sum_{i=1}^P \mathbf{x}t[[i]]^2$

Out[13]= 465.85

In[14]:= $\sum_{i=1}^P \mathbf{y}t[[i]] * \mathbf{x}t[[i]]$

Out[14]= -0.765946

Решаваме системата

In[15]:= $\mathbf{A} = \begin{pmatrix} P & \sum_{i=1}^P \mathbf{x}t[[i]] \\ \sum_{i=1}^P \mathbf{x}t[[i]] & \sum_{i=1}^P \mathbf{x}t[[i]]^2 \end{pmatrix}; \mathbf{b} = \left\{ \sum_{i=1}^P \mathbf{y}t[[i]], \sum_{i=1}^P \mathbf{y}t[[i]] * \mathbf{x}t[[i]] \right\};$

In[16]:= `LinearSolve[A, b]`

Out[16]= {0.0596113, 0.00750512}

Съставяме полинома

In[17]:= `P1[x_] := 0.0596113 + 0.00750512 x`

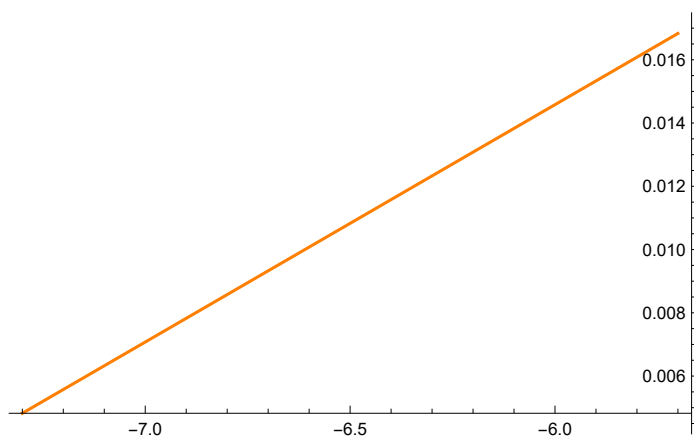
Таен коз (възможност за самопроверка)

In[18]:= `Fit[points, {1, x}, x]`

Out[18]= 0.0596113 + 0.00750512 x

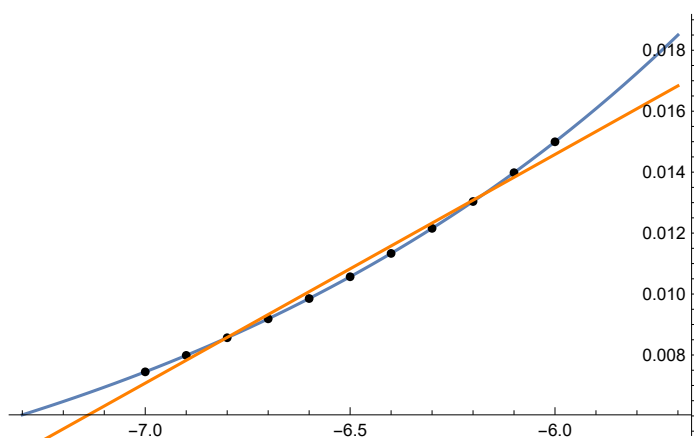
```
In[19]:= grfP1 = Plot[P1[x], {x, xt[[1]] - 0.3, xt[[P]] + 0.3}, PlotStyle -> Orange]
```

```
Out[19]=
```



```
In[20]:= Show[grf, grp, grfP1]
```

```
Out[20]=
```



```
In[21]:= P1[-5.97]
```

```
Out[21]= 0.0148057
```

За сравнение истинската стойност

```
In[22]:= f[-5.97]
```

```
Out[22]= 0.0153138
```

Оценка на грешката

Теоретична грешка (средноквадратична)

$$\text{In[23]:= } \sqrt{\sum_{i=1}^P (yt[[i]] - P1[xt[[i]]])^2}$$

```
Out[23]= 0.000767618
```

Истинска грешка

```
In[24]:= Abs[f[-5.97] - P1[-5.97]]
```

```
Out[24]= 0.00050808
```

Квадратична регресия

Попълваме таблицата

In[25]:= xt^2

Out[25]= {49., 47.61, 46.24, 44.89, 43.56, 42.25, 40.96, 39.69, 38.44, 37.21, 36.}

In[26]:= $yt * xt$

Out[26]= {-0.0521261, -0.055107, -0.0582461, -0.0615508, -0.0650285,
-0.0686868, -0.0725338, -0.0765776, -0.0808265, -0.0852889, -0.0899735}

In[27]:= xt^3

Out[27]= {-343., -328.509, -314.432, -300.763, -287.496,
-274.625, -262.144, -250.047, -238.328, -226.981, -216.}

In[28]:= xt^4

Out[28]= {2401., 2266.71, 2138.14, 2015.11, 1897.47,
1785.06, 1677.72, 1575.3, 1477.63, 1384.58, 1296.}

In[29]:= $yt * xt^2$

Out[29]= {0.364883, 0.380238, 0.396074, 0.41239, 0.429188,
0.446464, 0.464217, 0.482439, 0.501124, 0.520262, 0.539841}

Намиране на сумите

In[30]:= $\sum_{i=1}^P xt[i]$

Out[30]= -71.5

In[31]:= $\sum_{i=1}^P yt[i]$

Out[31]= 0.119108

In[32]:= $\sum_{i=1}^P xt[i]^2$

Out[32]= 465.85

In[33]:= $\sum_{i=1}^P yt[i] * xt[i]$

Out[33]= -0.765946

In[34]:= $\sum_{i=1}^P xt[i]^3$

Out[34]= -3042.33

```
In[35]:= 
$$\sum_{i=1}^P \text{xt}[[i]]^4$$

```

```
Out[35]= 19 914.7
```

```
In[36]:= 
$$\sum_{i=1}^P \text{yt}[[i]] * \text{xt}[[i]]^2$$

```

```
Out[36]= 4.93712
```

Решаваме системата

```
In[37]:= 
$$A = \begin{pmatrix} P & \sum_{i=1}^P \text{xt}[[i]] & \sum_{i=1}^P \text{xt}[[i]]^2 \\ \sum_{i=1}^P \text{xt}[[i]] & \sum_{i=1}^P \text{xt}[[i]]^2 & \sum_{i=1}^P \text{xt}[[i]]^3 \\ \sum_{i=1}^P \text{xt}[[i]]^2 & \sum_{i=1}^P \text{xt}[[i]]^3 & \sum_{i=1}^P \text{xt}[[i]]^4 \end{pmatrix};$$

```

```

$$b = \left\{ \sum_{i=1}^P \text{yt}[[i]], \sum_{i=1}^P \text{yt}[[i]] * \text{xt}[[i]], \sum_{i=1}^P \text{yt}[[i]] * \text{xt}[[i]]^2 \right\};$$

```

```
In[38]:= LinearSolve[A, b]
```

```
Out[38]= {0.169855, 0.0415066, 0.0026155}
```

Таен коз (възможност за самопроверка)

```
In[39]:= Fit[points, {1, x, x^2}, x]
```

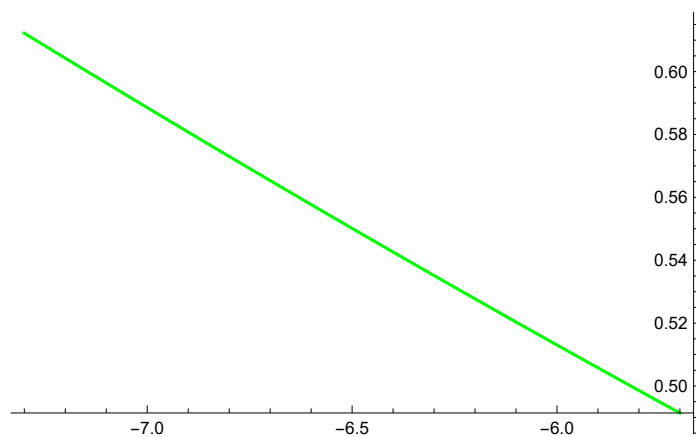
```
Out[39]= 0.169855 + 0.0415066 x + 0.0026155 x^2
```

Съставяме полинома

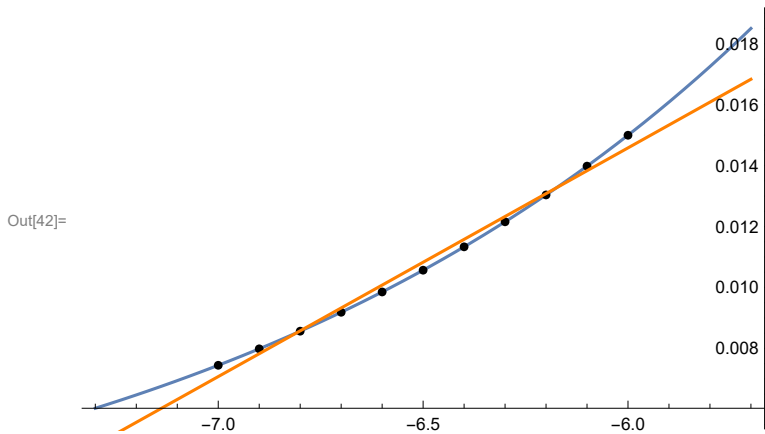
```
In[40]:= P2[x_] := 0.169855 - 0.0415066 x + 0.0026155 x^2
```

```
In[41]:= grfP2 = Plot[P2[x], {x, xt[[1]] - 0.3, xt[[P]] + 0.3}, PlotStyle -> Green]
```

```
Out[41]=
```



In[42]:= Show[grf, grp, grfP1, grfP2]



In[43]:= P2[-5.97]

Out[43]= 0.510868

За сравнение истинската стойност

In[44]:= f[-5.97]

Out[44]= 0.0153138

Оценка на грешката

Теоретична грешка (средноквадратична)

$$\text{In[45]:= } \sqrt{\sum_{i=1}^p (y_t[i] - P2[x_t[i]])^2}$$

Out[45]= 1.79172

Истинска грешка

In[46]:= Abs[f[-5.97] - P2[-5.97]]

Out[46]= 0.495554

Кубична регресия

Попълваме таблицата

In[47]:= xt^2

Out[47]= {49., 47.61, 46.24, 44.89, 43.56, 42.25, 40.96, 39.69, 38.44, 37.21, 36.}

In[48]:= $yt * xt$

Out[48]= {-0.0521261, -0.055107, -0.0582461, -0.0615508, -0.0650285,
-0.0686868, -0.0725338, -0.0765776, -0.0808265, -0.0852889, -0.0899735}

In[49]:= \mathbf{xt}^3 Out[49]= { -343., -328.509, -314.432, -300.763, -287.496,
-274.625, -262.144, -250.047, -238.328, -226.981, -216. }In[50]:= \mathbf{xt}^4 Out[50]= { 2401., 2266.71, 2138.14, 2015.11, 1897.47,
1785.06, 1677.72, 1575.3, 1477.63, 1384.58, 1296. }In[51]:= $\mathbf{yt} * \mathbf{xt}^2$ Out[51]= { 0.364883, 0.380238, 0.396074, 0.41239, 0.429188,
0.446464, 0.464217, 0.482439, 0.501124, 0.520262, 0.539841 }In[52]:= $\mathbf{yt} * \mathbf{xt}^3$ Out[52]= { -2.55418, -2.62364, -2.6933, -2.76302, -2.83264,
-2.90202, -2.97099, -3.03937, -3.10697, -3.1736, -3.23904 }In[53]:= \mathbf{xt}^5 Out[53]= { -16807., -15640.3, -14539.3, -13501.3, -12523.3,
-11602.9, -10737.4, -9924.37, -9161.33, -8445.96, -7776. }In[54]:= \mathbf{xt}^6 Out[54]= { 117649., 107918., 98867.5, 90458.4, 82654.,
75418.9, 68719.5, 62523.5, 56800.2, 51520.4, 46656. }

Намиране на сумите

In[55]:= $\sum_{i=1}^P \mathbf{xt}[[i]]$

Out[55]= -71.5

In[56]:= $\sum_{i=1}^P \mathbf{yt}[[i]]$

Out[56]= 0.119108

In[57]:= $\sum_{i=1}^P \mathbf{xt}[[i]]^2$

Out[57]= 465.85

In[58]:= $\sum_{i=1}^P \mathbf{yt}[[i]] * \mathbf{xt}[[i]]$

Out[58]= -0.765946

In[59]:= $\sum_{i=1}^P \mathbf{xt}[[i]]^3$

Out[59]= -3042.33

$$\text{In}[60]:= \sum_{i=1}^P x_{t[i]}^4$$

Out[60]= 19 914.7

$$\text{In}[61]:= \sum_{i=1}^P y_{t[i]} * x_{t[i]}^2$$

Out[61]= 4.93712

$$\text{In}[62]:= \sum_{i=1}^P x_{t[i]}^5$$

Out[62]= -130 659.

$$\text{In}[63]:= \sum_{i=1}^P x_{t[i]}^6$$

Out[63]= 859 185.

$$\text{In}[64]:= \sum_{i=1}^P y_{t[i]} * x_{t[i]}^3$$

Out[64]= -31.8988

Решаваме системата

$$\text{In}[65]:= \mathbf{A} = \begin{pmatrix} P & \sum_{i=1}^P x_{t[i]} & \sum_{i=1}^P x_{t[i]}^2 & \sum_{i=1}^P x_{t[i]}^3 \\ \sum_{i=1}^P x_{t[i]} & \sum_{i=1}^P x_{t[i]}^2 & \sum_{i=1}^P x_{t[i]}^3 & \sum_{i=1}^P x_{t[i]}^4 \\ \sum_{i=1}^P x_{t[i]}^2 & \sum_{i=1}^P x_{t[i]}^3 & \sum_{i=1}^P x_{t[i]}^4 & \sum_{i=1}^P x_{t[i]}^5 \\ \sum_{i=1}^P x_{t[i]}^3 & \sum_{i=1}^P x_{t[i]}^4 & \sum_{i=1}^P x_{t[i]}^5 & \sum_{i=1}^P x_{t[i]}^6 \end{pmatrix};$$

$$\mathbf{b} = \left\{ \sum_{i=1}^P y_{t[i]}, \sum_{i=1}^P y_{t[i]} * x_{t[i]}, \sum_{i=1}^P y_{t[i]} * x_{t[i]}^2, \sum_{i=1}^P y_{t[i]} * x_{t[i]}^3 \right\};$$

In[66]:= **LinearSolve**[A, b]

LinearSolve: Result for LinearSolve of badly conditioned matrix

{{11., -71.5, 465.85, -3042.33}, {-71.5, 465.85, -3042.33, 19914.7}, {465.85, -3042.33, 19914.7, -130659.}, {-3042.33, 19914.7, -130659., 859185.}} may contain significant numerical errors.

Out[66]= {0.33634, 0.118563, 0.014487, 0.000608794}

Таен коз (възможност за самопроверка)

In[67]:= **Fit**[points, {1, x, x², x³}, x]

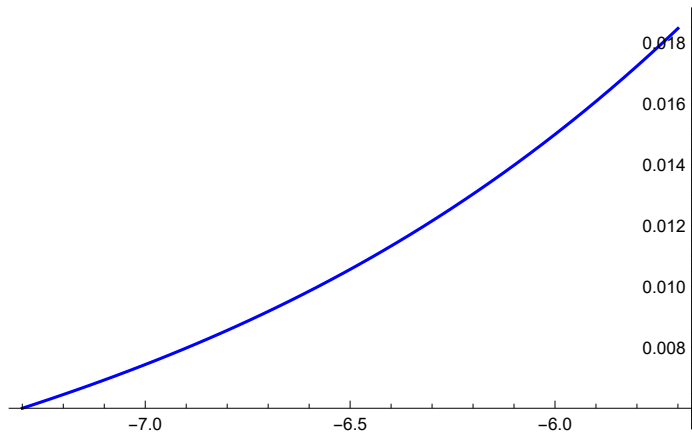
Out[67]= 0.33634 + 0.118563 x + 0.014487 x² + 0.000608793 x³

Съставяме полинома

In[68]:= **P3**[x_] := 0.33634 + 0.118563 x + 0.014487 x² + 0.000608793 x³

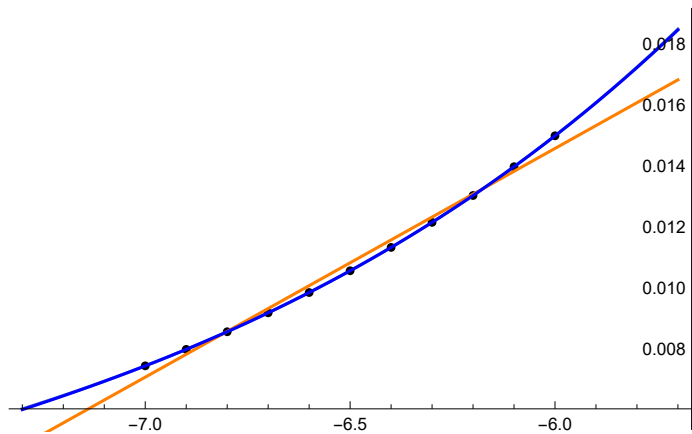
```
In[69]:= grfP3 = Plot[P3[x], {x, xt[[1]] - 0.3, xt[[P]] + 0.3}, PlotStyle -> Blue]
```

```
Out[69]=
```



```
In[70]:= Show[grf, grp, grfP1, grfP2, grfP3]
```

```
Out[70]=
```



Намиране на приближена стойност ($s = -b + (0.17)a + 0.01$)

```
In[71]:= s = -7 + (0.17 * 6) + 0.01
```

```
Out[71]= - 5.97
```

```
In[72]:= P3[-5.97]
```

```
Out[72]= 0.015312
```

За сравнение истинската стойност

```
In[73]:= f[-5.97]
```

```
Out[73]= 0.0153138
```

Оценка на грешката

Теоретична грешка (средноквадратична)

```
In[74]:= 
$$\sqrt{\sum_{i=1}^P (yt[[i]] - P3[xt[[i]]])^2}$$

```

```
Out[74]= 2.17888 × 10-6
```

Истинска грешка

In[75]:= **Abs**[f[-5.97] - P3[-5.97]]

Out[75]= 1.85012×10^{-6}