Parameter Estimation Example

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A very simple example of fitting a function or model to data by using least squares.

The Data: Here are some hypothetical data in the form of (t,y) pairs:

 $\label{eq:limit} \mbox{In[1]:=} \mbox{ data = \{\{1.1, 1.24\}, \{1.9, 0.83\}, \{2.3, 0.71\}, \{4.1, 0.29\}, \{5.5, 0.15\}\}}$

A plot of the data:

In[2]:= plt1 = ListPlot[data]

The Model and Sum of Squares: Let's fit a model f(t) = a*exp(b*t) to this data by adjusting a and b. First form a sum of squares

$In[33]:= f[t_] = a * Exp[b * t]$

 $SS[a_, b_] = Sum[(f[data[j, 1]] - data[j, 2])^2, {j, 1, 5}]$

With only two parameters "a" and "b", a visual estimate of the best choice (the choices of a and b that minimize SS) can be found by plotting. It's clear that b<0 since the data decays, and also that a>1. A plot of log(SS) is more informative, though:

In[6]:= Plot3D[Log[SS[a, b]], {a, 1, 3}, {b, -1, 0}]

Rotate the graph around. Something around a = 2, b = -0.5 looks promising.

Minimizing the Sum of Squares: The multivariable calculus approach is to find a critical point. Form the appropriate derivatives

In[22]:= dSSda = D[SS[a, b], a] dSSdb = D[SS[a, b], b] optab = FindRoot[{dSSda == 0, dSSdb == 0}, {a, 2.0}, {b, -0.5}]

The residual sum of squares is

In[25]:= SS[a, b] /. optab

A plot the best-fit f(t) to compare to the data:

In[50]:= bestf[t_] = f[t] /. optab
plt2 = Plot[bestf[t], {t, 1.1, 5.5}, PlotStyle → {Red}];
Show[plt1, plt2]