

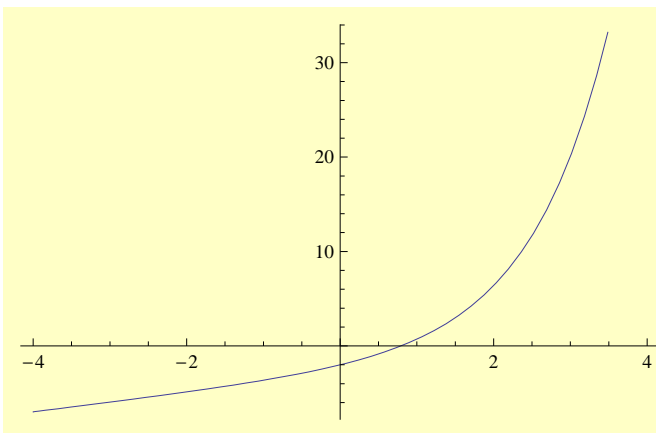
Newton's Method

Example : Find the root of $f(x) = e^x + x - 3 = 0$

If we draw the graph of $f(x)$, we can see that the root of $f(x) = 0$ is the x - coordinate of the point where the curve intersects with the x - axis.

```
In[1]:= f = Exp[x] + x - 3;  
Plot[f, {x, -4, 4}]
```

Out[2]=



The derivative and tangent line at a given point $(x_0, y_0) = (x_0, f[x_0])$ is given by $f'[x_0] * (x - x_0) + y_0$

```
In[3]:= df = D[f, x];  
slope = df /. x -> x0;  
y0 = f /. x -> x0;  
tangentline = slope * (x - x0) + y0
```

Out[6]=

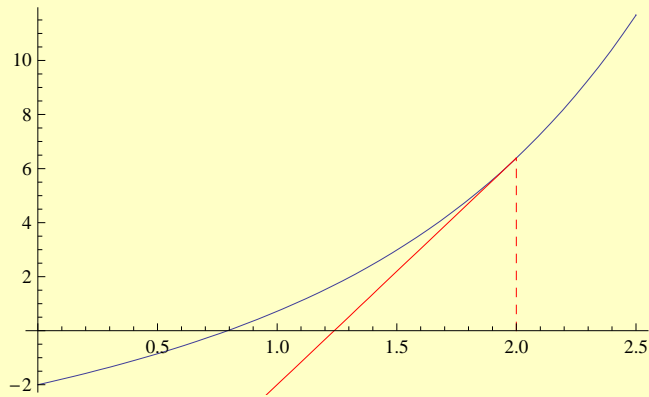
$$-3 + e^{x_0} + (1 + e^{x_0})(x - x_0) + x_0$$

To find the root, we will use the Newton's iteration. First, choose a starting point, for example, $x_0=2$. Clearly this is not the root. Draw the tangent line at $x_0=2$:

```
In[7]:= plotf = Plot[f, {x, 0, 2.5}];
plotp0 = Graphics[{Red, Dashed, Line[{{2, 0}, {2, f /. x -> 2}}] }];
tangentline0 = tangentline /. x0 -> 2
plott0 = Plot[tangentline0, {x, 0, 2}, PlotStyle -> {Red}];
Show[plotf, plotp0, plott0]
```

```
Out[9]= -1 + e2 + (1 + e2) (-2 + x)
```

```
Out[11]=
```



The tangent line intersect with the x - axis at a point. Let us find the coordinate of this point :

```
In[12]:= NSolve[tangentline0 == 0, x]
```

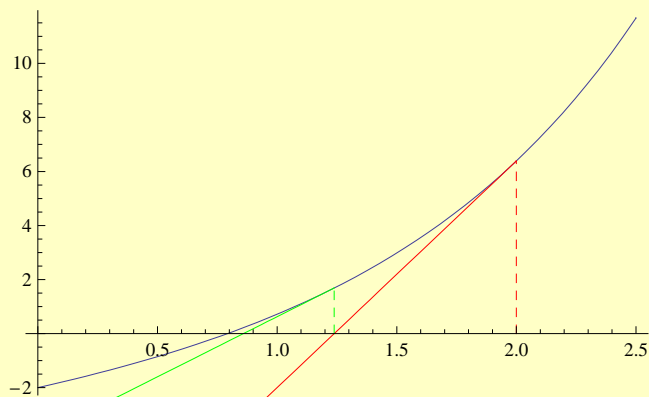
```
Out[12]= {{x -> 1.23841}}
```

From the graph, we can see that 1.23841 is closer to the solution of $f(x)=0$ than 2. Now repeat the above process, draw the tangent line at 1.23841.

```
In[13]:= plotp1 = Graphics[{Green, Dashed, Line[{{1.23841, 0}, {1.23841, f /. x -> 1.23841}}] }];
tangentline1 = tangentline /. x0 -> 1.23841
plott1 = Plot[tangentline1, {x, 0, 1.23841}, PlotStyle -> {Green}];
Show[plotf, plotp0, plott0, plotp1, plott1]
```

```
Out[14]= 1.68853 + 4.45012 (-1.23841 + x)
```

```
Out[16]=
```



Find the intersection point of the second tangent line with the x - axis :

```
In[17]:= NSolve[tangentline1 == 0, x]
```

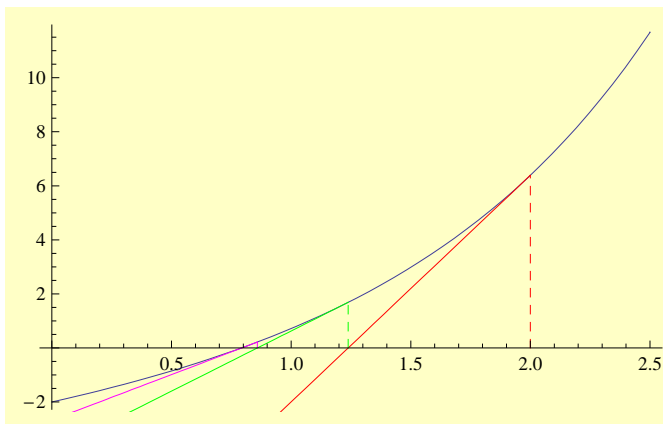
```
Out[17]:= {{x -> 0.858975}}
```

0.858975 is closer to the solution of $f(x) = 0$ than both 1.23841 and 2. Let repeat the process again using the new point:

```
In[18]:= plotp2 =
  Graphics[{Magenta, Dashed, Line[{{0.858975, 0}, {0.858975, f /. x -> 0.858975}}] }];
tangentline2 = tangentline /. x0 -> 0.858975
plott2 = Plot[tangentline2, {x, 0, 0.858975}, PlotStyle -> {Magenta}];
Show[plotf, plotp0, plott0, plotp1, plott1, plotp2, plott2]
```

```
Out[19]:= 0.219715 + 3.36074 (-0.858975 + x)
```

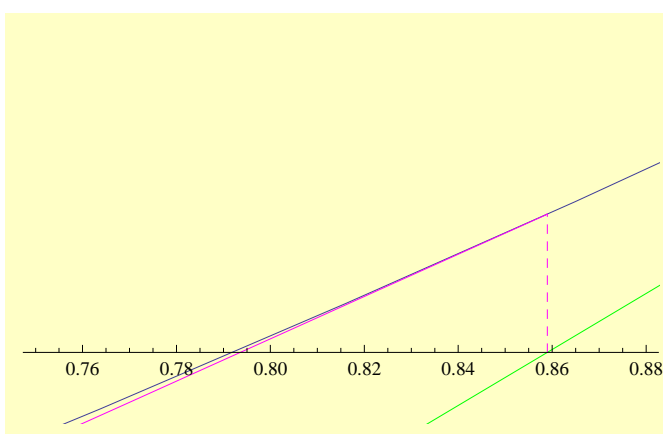
```
Out[21]=
```



We can zoom-in to have a better view :

```
In[22]:= Show[{plotf, plotp0, plott0, plotp1, plott1, plotp2, plott2},
  PlotRange -> {{0.75, 0.88}, {-0.1, 0.5}}]
```

```
Out[22]=
```



The intersection of the magenta tangentline with the x - axis is very close to the actual solution of $f(x) = 0$. We can expect that repeating the above process will give us even better approximation to the solution. In *Mathematica*, there's a neat way to complete the entire process in one single command. We first define a function called `NewtonsMethodList` :

```
In[23]:= NewtonsMethodList[f_, {x_, x0_}, n_] :=
  N[NestList[# - Function[x, f][#] / Derivative[1][Function[x, f]][#] &, x0, n]]
```

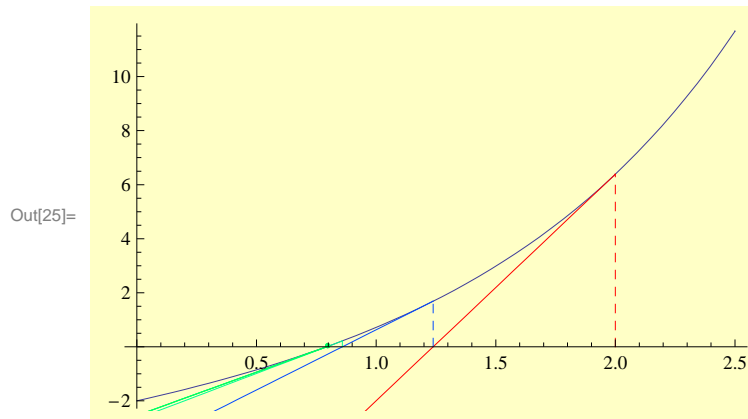
In the above definition, $(f_, x_, x0_, n_)$ are input parameters. $f_$ is the expression to be solved, $x_$ is the name of the unknown variable, $x0_$ is the starting point, $n_$ is the number of iterations (repeat the tangent line process $n_$ times). Now let's use this function to find the root of $f(x) = e^x + x - 3 = 0$.

```
In[24]:= values = NewtonsMethodList[Exp[x] + x - 3, {x, 2}, 5]
```

```
Out[24]:= {2., 1.23841, 0.858974, 0.793598, 0.792061, 0.79206}
```

The values given in the above list are exactly the intersection of tangentlines with the x - axis, as we have seen earlier. They converge to 0.79206, which is the solution of $f(x)=0$. We can draw the graph of the approximation.

```
In[25]:= Show[{plotf, Table[Plot[tangentline, {x, -1, x0}, PlotStyle -> {Hue[x0 / 2]}], {x0, values}],
  Table[Graphics[{Hue[x0 / 2], Dashed, Line[{x0, 0}, {x0, f /. x -> x0}]}], {x0, values}]]
```



Mathematica also provide a built - in function "FindRoot" to solve the problem.It gives the same answer as what we have seen in the above.

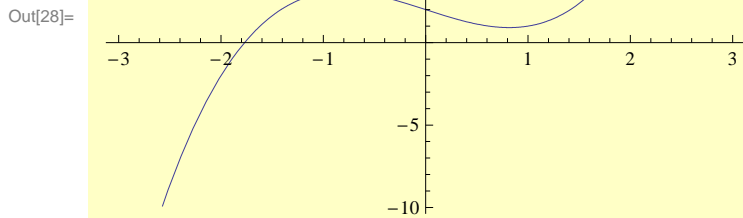
```
In[26]:= FindRoot[Exp[x] + x - 3 == 0, {x, 2}]
```

```
Out[26]:= {x -> 0.79206}
```

Example : Choosing the first point is sometimes important.

Consider the root of $f(x) = x^3 - 2x + 2 = 0$. From the following graph, it should be between -2 and -1 .

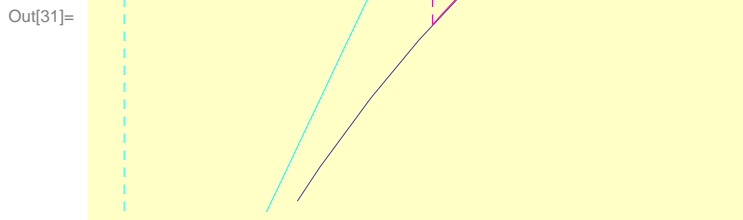
```
In[27]:= f = x^3 - 2*x + 2;
plotf = Plot[f, {x, -3, 3}]
tangentline = (D[f, x] /. x -> x0) * (x - x0) + (f /. x -> x0);
```



If we use the starting point $x_0 = -3$, we will get the correct solution around -1.76929.

```
In[30]:= values = NewtonsMethodList[x^3 - 2*x + 2, {x, -3}, 5]
Show[{plotf, Table[Plot[tangentline, {x, -1, x0}, PlotStyle -> {Hue[x0/2]}], {x0, values}],
Table[
Graphics[{Hue[x0/2], Dashed, Line[{{x0, 0}, {x0, f /. x -> x0}}] ]], {x0, values}],
PlotRange -> {{-3, -1.5}, {-10, 1}}]
```

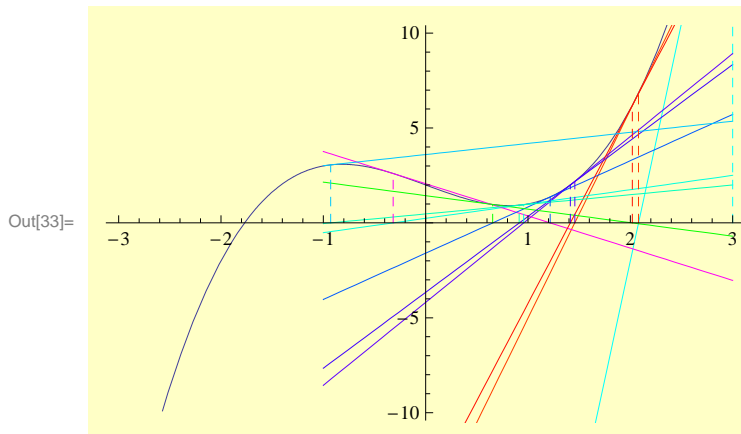
Out[30]= {-3., -2.24, -1.87537, -1.77656, -1.76933, -1.76929}



However, if we choose the starting point $x = 3$, we won't get the correct solution. Because the Newton's iteration can not pass through the local minimum near $x=1$. The tangents will be bouncing back and forth over this point.

```
In[32]:= values = NewtonsMethodList[x^3 - 2*x + 2, {x, 3}, 10]
Show[{{plotf, Table[Plot[tangentline, {x, -1, 3}, PlotStyle -> {Hue[x0 / 2]}], {x0, values}],
Table[
Graphics[{{Hue[x0 / 2], Dashed, Line[{{x0, 0}, {x0, f /. x -> x0}}] ]}, {x0, values}]},
PlotRange -> {{-3, 3}, {-10, 10}}]
```

```
Out[32]:= {3., 2.08, 1.4571, 0.958312, -0.317641,
1.2161, 0.655382, 2.01989, 1.41429, 0.914292, -0.928409}
```



It is the same if we use "FindRoot" with these two different starting points.

```
In[34]:= FindRoot[f, {x, -3}]
```

```
Out[34]:= {x -> -1.76929}
```

```
In[35]:= FindRoot[f, {x, 3}]
```

FindRoot::lstol :

The line search decreased the step size to within tolerance specified by AccuracyGoal and PrecisionGoal but was unable to find a sufficient decrease in the merit function. You may need more than MachinePrecision digits of working precision to meet these tolerances. >>

```
Out[35]:= {x -> 0.816497}
```