

# Newton method based on numerical differentiation

Jacobian calculation

# Newton method for root finding

- An iterative approach
  - Updating rule
  - While-looping
  - Halting condition
- Symbolic differentiation
-

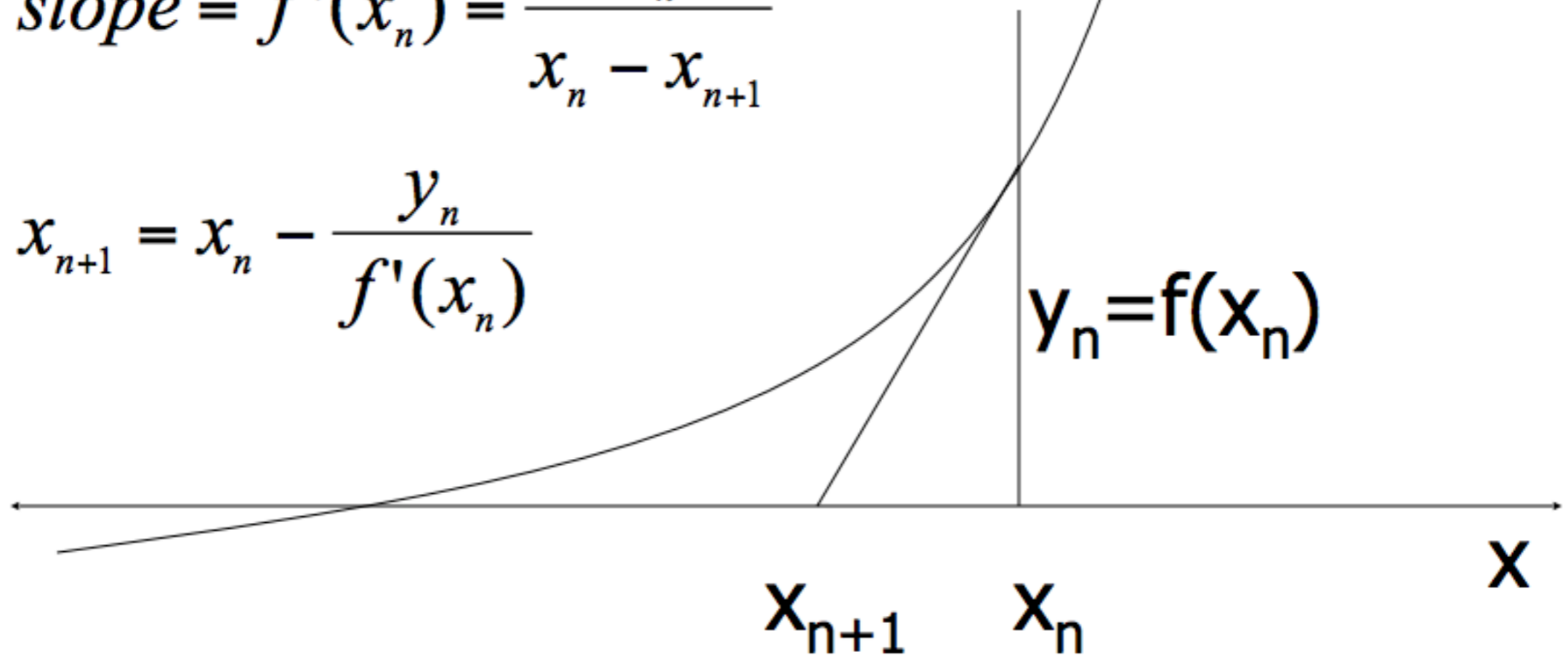
# Tangent line

$y=f(x)$

$$\text{slope} = f'(x_n) = \frac{y_n}{x_n - x_{n+1}}$$

$$x_{n+1} = x_n - \frac{y_n}{f'(x_n)}$$

$y_n = f(x_n)$



# Iterative approach

```
s='x.^2-5*x+6'  
f=inline(s); x=sym('x')  
ss=['diff(' s ')'];  
s1=eval(ss);  
f1=inline(s1); x_zero=rand;
```

~( abs(f(x\_zero)) < 10^-6)

$$x_{n+1} = x_n - \frac{f(x_n)}{f'(x_n)}$$

```
x_zero=x_zero-f(x_zero)/f1(x_zero)
```

```
s='x.^2-5*x+6'  
f=inline(s); x=sym('x')  
ss=['diff(' s ')'];  
s1=eval(ss);  
f1=inline(s1);  
x_zero=rand;  
while ~(abs(f(x_zero))< 10^-6)  
    x_zero=x_zero-f(x_zero)/f1(x_zero)  
end
```

symbolic  
differentiation

halting  
cond.

updating rule

# Richardson extrapolation

$$f'(x) \approx \varphi\left(\frac{h}{2}\right) + \frac{1}{3} \left[ \varphi\left(\frac{h}{2}\right) - \varphi(h) \right]$$

$$\varphi(h) = \frac{f(x+h) - f(x-h)}{2h}$$

```
s='x.^2-5*x+6'  
f=inline(s);  
% x=sym('x')  
% ss=['diff(' s ')'];  
% s1=eval(ss);  
% f1=inline(s1);  
x_zero=rand;  
while ~(abs(f(x_zero))< 10^-6)  
    fn=...  
    x_zero=x_zero-f(x_zero)/fn  
end
```

symbolic  
differentiation

halting  
cond.

Apply numerical differentiation of Richardson  
Extrapolation to determine  $f'(x\_zero)$

```
s1='3*x1-cos(x2*x3)-1/2';  
s2='x1^2-81*(x2+0.1)^2+sin(x3)+1.06';  
s3='exp(-x1*x2)+20*x3+1/3*(10*pi-3)';  
x1=sym('x1');x2=sym('x2');x3=sym('x3');  
f=inline([str2sym(s1);str2sym(s2);str2sym(s3)]);  
A=jacobian([str2sym(s1);str2sym(s2);str2sym(s3)],[x1 x2 x3]);  
j=inline(A);  
x=rand(3,1)-0.5;  
y=f(x(1),x(2),x(3))  
j(x(1),x(2),x(3))
```

Calculate  
Jacobian by  
symbolic  
differentiation

y =

-2.5738  
1.5538  
18.7591

ans =

3.0000 -0.0135 0.0025  
-0.7162 -3.5253 0.9148  
0.0761 0.3482 20.0000



$$\mathbf{x}_{n+1} = \mathbf{x}_n - [J(\mathbf{x}_n)]^{-1} F(\mathbf{x}_n)$$

$$J(\mathbf{x}) = \begin{bmatrix} \frac{\partial f_1(\mathbf{x})}{\partial x_1} & \frac{\partial f_1(\mathbf{x})}{\partial x_2} & \cdots & \frac{\partial f_1(\mathbf{x})}{\partial x_n} \\ \frac{\partial f_2(\mathbf{x})}{\partial x_1} & \frac{\partial f_2(\mathbf{x})}{\partial x_2} & \cdots & \frac{\partial f_2(\mathbf{x})}{\partial x_n} \\ \vdots & \vdots & \ddots & \mathbf{M} \\ \frac{\partial f_n(\mathbf{x})}{\partial x_1} & \frac{\partial f_n(\mathbf{x})}{\partial x_2} & \cdots & \frac{\partial f_n(\mathbf{x})}{\partial x_n} \end{bmatrix}$$

```

s1='3*x1-cos(x2*x3)-1/2';
s2='x1^2-81*(x2+0.1)^2+sin(x3)+1.06';
s3='exp(-x1*x2)+20*x3+1/3*(10*pi-3)';
x1=sym('x1');x2=sym('x2');x3=sym('x3');
f=inline([str2sym(s1);str2sym(s2);str2sym(s3)]);
% A=jacobian([str2sym(s1);str2sym(s2);str2sym(s3)],[x1 x2 x3]);
% j=inline(A);
x=rand(3,1)-0.5;
y=f(x(1),x(2),x(3))
% j(x(1),x(2),x(3))
...
...
...

```

Try to calculate Jacobian by numerical differentiation of Richardson Extrapolation and compare it with previous results

y =

```

-2.5738
 1.5538
18.7591

```

ans =

```

 3.0000 -0.0135  0.0025
-0.7162 -3.5253  0.9148
 0.0761  0.3482 20.0000

```

[http://www.cs.toronto.edu/~hinton/absps/  
NatureDeepReview.pdf](http://www.cs.toronto.edu/~hinton/absps/NatureDeepReview.pdf)