

NA11 Prirodni kubicni splajn

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1 Prirodni kubični splajn

Neka je zadana funkcija $f(x)$ na intervalu $[a, b]$.

Odaberimo $n + 1$ točku

$$a \equiv x_0 < x_1 < x_2 < \dots < x_n \equiv b$$

i izračunajmo vrijednosti

$$y_i = f(x_i), \quad i = 0, 1, \dots, n.$$

Na intervalu $[x_{i-1}, x_i]$ funkciju f aproksimiramo kubičnim polinomom C_i , tako da je na intervalu $[a, b]$ funkcija f aproksimirana funkcijom

$$C(x) = C_i(x), \quad x \in [x_{i-1}, x_i]$$

Od funkcije $C(x)$ tražimo

- *neprekidnost,*
- *neprekidnost prve derivacije i*
- *neprekidnost druge derivacije.*

Dakle,

$$\begin{aligned} C_i(x_{i-1}) &= y_{i-1}, \quad i = 1, \dots, n, \\ C_i(x_i) &= y_i \quad i = 1, \dots, n, \\ C'_i(x_i) &= C'_{i+1}(x_i), \quad i = 1, \dots, n-1, \\ C'_i(x_i) &= C'_{i+1}(x_i), \quad i = 1, \dots, n-1, \end{aligned}$$

pa imamo sustav od $4n - 2$ jednadžbe i $4n$ nepoznanica (svaki od n polinoma ima 4 koeficijenta).

Vrijede sljedeće tvrdnje:

$$C_i(x) = y_{i-1} - s_{i-1} \frac{h_i^2}{6} + b_i(x - x_{i-1}) + \frac{s_{i-1}}{6h_i}(x - x_{i-1})^3 + \frac{s_i}{6h_i}(x - x_{i-1})^3,$$

gdje je

$$b_i = d_i - (s_i - s_{i-1}) \frac{h_i}{6},$$

$$d_i = \frac{y_i - y_{i-1}}{h_i},$$

$$h_i = x_i - x_{i-1},$$

a brojevi $s_i, i = 0, 1, \dots, n$, zadovoljavaju sustav jednačbi

$$s_{i-1}h_i + 2s_i(h_i + h_{i+1}) + s_{i+1}h_{i+1} = 6(d_{i+1} - d_i), \quad i = 1, \dots, n-1.$$

Ako zadamo s_0 i s_n , sustav će imati jedinstveno rješenje.

Najčešće su zadani *prirodni uvjeti*:

$$s_0 = 0, \quad s_n = 0.$$

U tom slučaju, s_1, \dots, s_{n-1} su rješenja sustava

$$\begin{bmatrix} 2(h_1 + h_2) & h_2 & 0 & \cdots & 0 & 0 \\ h_2 & 2(h_2 + h_3) & h_3 & \cdots & 0 & 0 \\ 0 & h_3 & 2(h_3 + h_4) & \cdots & 0 & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ 0 & 0 & 0 & \cdots & 2(h_{n-2} + h_{n-1}) & h_{n-1} \\ 0 & 0 & 0 & \cdots & h_{n-1} & 2(h_{n-1} + h_n) \end{bmatrix} \begin{bmatrix} s_1 \\ s_2 \\ s_3 \\ \vdots \\ s_{n-2} \\ s_{n-1} \end{bmatrix} = \begin{bmatrix} 6(d_2 - d_1) \\ 6(d_3 - d_2) \\ 6(d_4 - d_3) \\ \vdots \\ 6(d_{n-1} - d_{n-2}) \\ 6(d_n - d_{n-1}) \end{bmatrix}.$$

Dokaz se nalazi u udžbeniku [Numerička matematika, str. 29](#).

Matrica sustava je *tridijagonalna* i *pozitivno definitna* pa se sustav može riješiti metodom Choleskog (bez pivotiranja) u $O(n)$ operacija.

Vrijede ocjene pogreške:

$$\begin{aligned} \max |f(x) - C(x)| &\leq \frac{5}{384} \max h_i^4 \\ \max |f'(x) - C'(x)| &\leq \frac{1}{24} \max h_i^3 \\ \max |f''(x) - C''(x)| &\leq \frac{3}{8} \max h_i^2. \end{aligned}$$

Ocjene se mogu promatrati i na svakom intervalu posebno.

1.1 Primjer - Interpolacija slučajnih točaka

```
In [1]: using Polynomials
```

```
using Gadfly
```

```
include("Vandermonde.jl")
```

```
Out[1]: full (generic function with 1 method)
```

```
In [2]: # Broj intervala
```

```
srand(123)
```

```
n=5
```

```
x=sort(rand(n+1))
```

```
y=rand(n+1)
```

```
h=x[2:end]-x[1:end-1]
```

```
d=(y[2:end]-y[1:end-1])./h
```

```
H=SymTridiagonal(2*(h[1:end-1]+h[2:end]),h[2:end-1])
```

```
Out[2]: 4×4 SymTridiagonal{Float64}:
```

```
0.698622  0.267102  .  .
0.267102  0.557011  0.0114039  .
.  0.0114039  0.211786  0.094489
.  .  0.094489  0.533113
```

```
In [3]: b1=6*(d[2:end]-d[1:end-1])
```

```
s=H\b1
```

```
s=[0;s;0]
```

```
Out[3]: 6-element Array{Float64,1}:
```

```
0.0
155.934
-243.764
456.445
-67.1929
0.0
```

```
In [4]: # Definirajmo polinome
```

```
b=d-(s[2:end]-s[1:end-1]).*h/6
```

```
C=Array{Any}(n)
```

```
C=[xx -> y[i]-s[i]*h[i]^2/6+b[i]*(xx-x[i])+s[i]*(x[i+1]-xx)^3/(6*h[i])
+s[i+1]*(xx-x[i])^3/(6*h[i]) for i=1:n]
```

```
Out[4]: 5-element Array{##2#4{Int64},1}:
```

```
#2
#2
#2
#2
#2
```

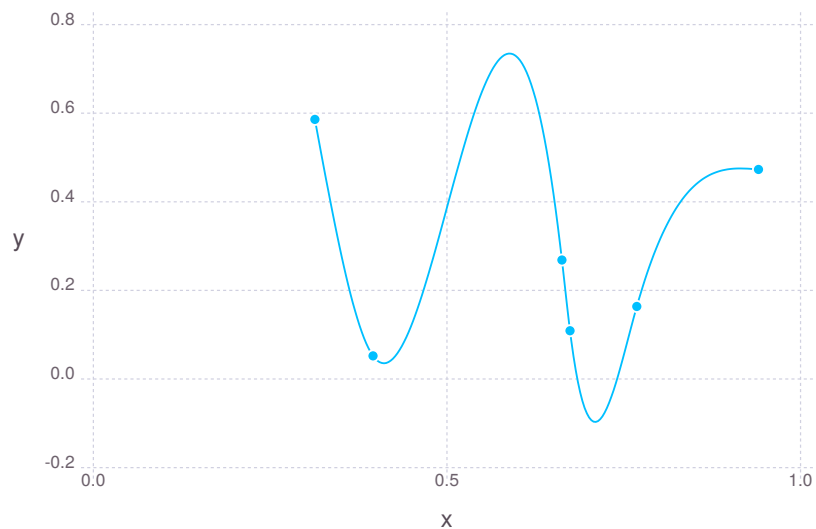
```

In [5]: # Definirajmo točke za crtanje
        lsize=200
        xx=linspace(x[1],x[end],lsize)
        ySpline=Array{Float64}(lsize)
        for i=1:lsize
            for k=1:n
                if xx[i]<=x[k+1]
                    ySpline[i]=C[k](xx[i])
                    break
                end
            end
        end

In [6]: # Crtanje
        plot(layer(x=x,y=y,Geom.point),layer(x=xx,y=ySpline,Geom.line))

```

Out [6]:



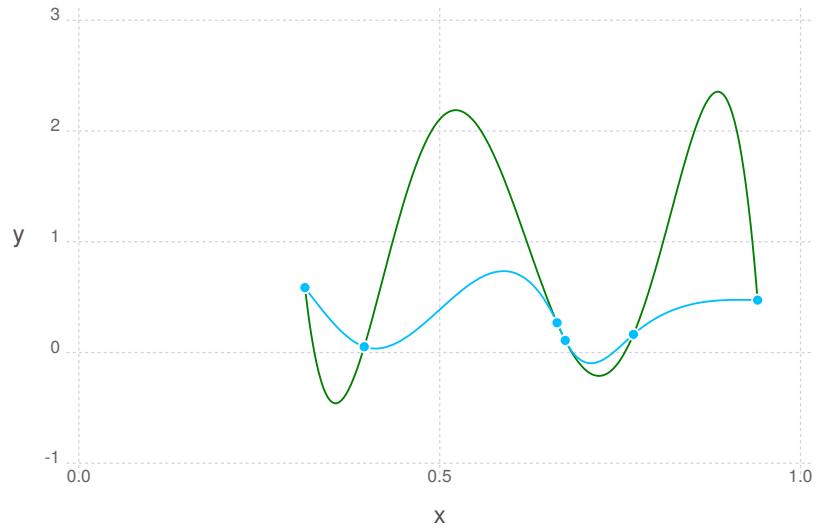
Usporedimo splajn s interpolacijskim polinomom:

```

In [7]: A=Vandermonde(x)
        p=Poly(A\y)
        yPoly=polyval(p,xx)
        plot(layer(x=x,y=y,Geom.point),layer(x=xx,y=ySpline,Geom.line),
              layer(x=xx,y=yPoly,Geom.line,Theme(default_color=colorant"green")))

```

Out [7]:



Usporedimo splajn s interpolacijskim polinomom kada mijenjamo jednu točku:

```
In [8]: using Interact
```

```
INFO: Interact.jl: using new nbwidgetsextension protocol
```

```
In [9]: # Traje duze!
```

```
point=3
xc=deepcopy(x)

ySpline=Array{Float64}(lsize)
yPoly=Array{Float64}(lsize)
C=Array{Any}(n)

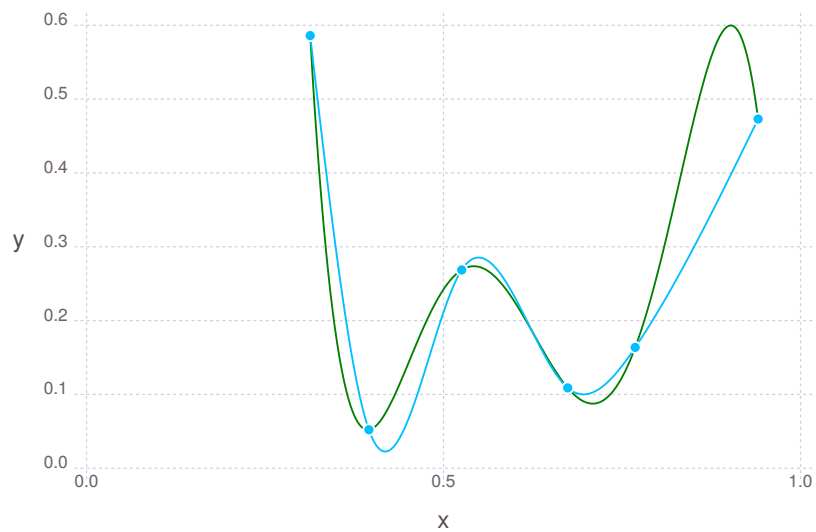
@manipulate for xp=xc[point-1]:0.01:xc[point+1]
    xc[point]=xp
    h=xc[2:end]-xc[1:end-1]
    d=(y[2:end]-y[1:end-1])./h
    H=SymTridiagonal(2*(h[1:end-1]+h[2:end]),h[2:end-1])
    b1=6*(d[2:end]-d[1:end-1])
    s=H\b1
    s=[0;s;0]
    b=d-(s[2:end]-s[1:end-1]).*h/6
    C=[xx->y[i]-s[i]*h[i]^2/6+b[i]*(xx-xc[i])+s[i]*(xc[i+1]-xx)^3/(6*h[i])
        +s[i+1]*(xx-xc[i])^3/(6*h[i]) for i=1:n]
    for i=1:lsize
        for k=1:n
```

```

        if xx[i]<=xc[k+1]
            ySpline[i]=C[k](xx[i])
            break
        end
    end
end
end
A=Vandermonde(xc)
p=Poly(A\y)
yPoly=polyval(p,xx)
plot(layer(x=xc,y=y,Geom.point),layer(x=xx,y=ySpline,Geom.line),
      layer(x=xx,y=yPoly,Geom.line,Theme(default_color=colorant"green")))
end

```

Out [9] :



1.2 Primjer - Interpolacija funkcije $\sin(x)$

```

In [10]: n=5
         a=0
         b=pi
         f(x)=sin.(x)

         x=collect(linspace(a,b,n+1))
         y=f(x)
         lsize=200
         xx=collect(linspace(a,b,lsize))

```

```

ySpline=Array{Float64}(lsize)
yPoly=Array{Float64}(lsize)
yFun=f(xx)

point=3
xc=deepcopy(x)
yc=deepcopy(y)
@manipulate for xp=xc[point-1]:0.01:xc[point+1]
    # Splajn
    xc[point]=xp
    yc[point]=sin(xp)
    h=xc[2:end]-xc[1:end-1]
    d=(yc[2:end]-yc[1:end-1])./h
    H=SymTridiagonal(2*(h[1:end-1]+h[2:end]),h[2:end-1])
    b1=6*(d[2:end]-d[1:end-1])
    s=H\b1
    s=[0;s;0]
    b=d-(s[2:end]-s[1:end-1]).*h/6
    C=Array{Any}(n)
    C=[xx-> yc[i]-s[i]*h[i]^2/6+b[i]*(xx-xc[i])+s[i]*(xc[i+1]-xx)^3/(6*h[i])
        +s[i+1]*(xx-xc[i])^3/(6*h[i]) for i=1:n]
    for i=1:lsize
        for k=1:n
            if xx[i]<=xc[k+1]
                ySpline[i]=C[k](xx[i])
                break
            end
        end
    end
end

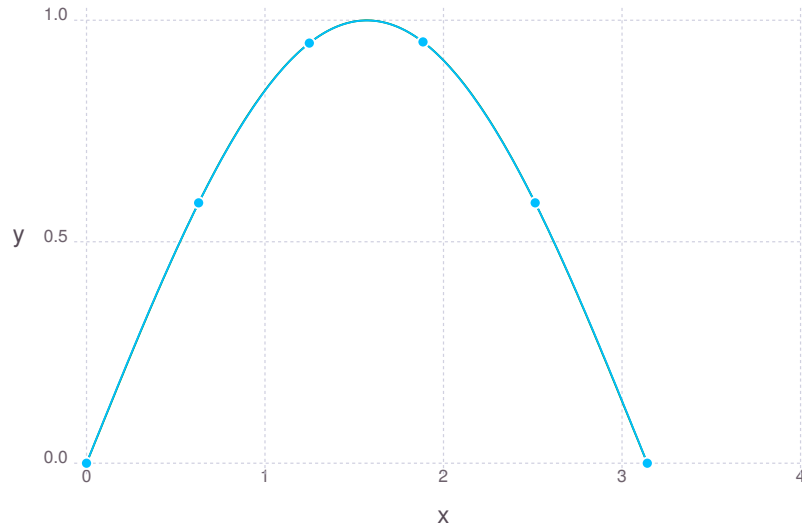
# Polinom
A=Vandermonde(xc)
p=Poly(A\yc)
yPoly=polyval(p,xx)

plot(layer(x=xc,y=yc,Geom.point),layer(x=xx,y=ySpline,Geom.line),
     layer(x=xx,y=yPoly,Geom.line,Theme(default_color=colorant"green")))

# Pogreske
#=
norm(ySpline[2:end-1]-yFun[2:end-1],Inf),
norm((ySpline[2:end-1]-yFun[2:end-1])./yFun[2:end-1],Inf),
norm(yPoly[2:end-1]-yFun[2:end-1],Inf),
norm((yPoly[2:end-1]-yFun[2:end-1])./yFun[2:end-1],Inf)
=#
end

```

Out [10]:



1.3 Primjer - Interpolacija funkcije $f(x) = 1 - |x - 1|$, $x \in [0, 2]$

```
In [11]: n=10
         a=0
         b=2
         f(x)=1-abs.(x-1)

         # Ravnomjerno raspoređene točke
         x=collect(linspace(a,b,n+1))
         y=f(x)
         lsize=200
         xx=collect(linspace(a,b,lsize))
         ySpline=Array{Float64}(lsize)
         yPoly=Array{Float64}(lsize)
         yFun=f(xx)

         point=3
         xc=deepcopy(x)
         yc=deepcopy(y)
         @manipulate for xp=xc[point-1]:0.01:xc[point+1]
             # Splajn
             xc[point]=xp
             yc[point]=sin(xp)
             h=xc[2:end]-xc[1:end-1]
             d=(yc[2:end]-yc[1:end-1])./h
             H=SymTridiagonal(2*(h[1:end-1]+h[2:end]),h[2:end-1])
```



```

b1=6*(d[2:end]-d[1:end-1])
s=H\b1
s=[0;s;0]
b=d-(s[2:end]-s[1:end-1]).*h/6
C=Array{Any}(n)
C=[xx-> yc[i]-s[i]*h[i]^2/6+b[i]*(xx-xc[i])+s[i]*(xc[i+1]-xx)^3/(6*h[i])
      +s[i+1]*(xx-xc[i])^3/(6*h[i]) for i=1:n]
for i=1:lsiz
    for k=1:n
        if xx[i]<=xc[k+1]
            ySpline[i]=C[k](xx[i])
            break
        end
    end
end
end

# Polinom
A=Vandermonde(xc)
p=Poly(A\yc)
yPoly=polyval(p,xx)

plot(layer(x=xc,y=yc,Geom.point),layer(x=xx,y=ySpline,Geom.line),
      layer(x=xx,y=yPoly,Geom.line,Theme(default_color=colorant"green")))
end

```

Out[11]:

