

```

restart
interface(warnlevel=0);
with(LinearAlgebra) :
with(plots) :
with(ArrayTools) :

CubicSplineInterpolation_ := proc(points)
    #local n, h, vars_c, i,j, M, c, d, a_params, b_params, d_params,
    system_c, spline_3;

    n := numelems(points) - 1; # Количество узлов интерполяции
    h := 0.1; # Шаг между узлами
    # Вычисление коэффициентов векторов для кубических сплайнов
    vars_c := [seq(c[i], i=1..(n+1))];
    system_c := [c[1]=0];
    for i from 2 to n + 1 do
        if i = (n+1) then
            system_c := [seq(system_c[j], j=1..(i-1)), c[i]=0];

        else
            system_c :=  $\left[ \text{seq}(\text{system\_c}[j], j=1..(i-1)), c[i-1] \cdot h + 2 \right.$ 
 $\cdot 2 \cdot h \cdot c[i] + c[i+1] \cdot h = 6 \cdot \left( \frac{\text{points}[(i+1), 2] - \text{points}[i, 2]}{h} \right.$ 
 $\left. - \frac{\text{points}[i, 2] - \text{points}[(i-1), 2]}{h} \right) \left. \right]$ ;
            #system_c;
        end if;
    end do;
    M := GenerateMatrix(system_c, vars_c, augmented = true);
    c := LinearSolve(M);
    a_params := seq(points[i, 2], i=2..(n+1)) ;
    d_params := seq $\left( \frac{c[i] - c[i-1]}{h}, i=2..(n+1) \right)$  ;
    b_params := seq $\left( \frac{\text{points}[i, 2] - \text{points}[i-1, 2]}{h} + \frac{c[i] \cdot h}{3} \right.$ 
 $\left. + \frac{c[i-1] \cdot h}{6}, i=2..(n+1) \right)$  ;
    system_s := seq $\left( a\_params[i] + b\_params[i] \cdot (x - \text{points}[i+1, 1]) \right)$ 

```

$$+ \frac{c[i + 1]}{2} \cdot (x - points[i + 1, 1])^2 + \frac{d_params[i]}{6} \cdot (x - points[i + 1, 1])^3, i = 1 \dots n \quad \Bigg) ;$$

```
spline_3 := piecewise(0 ≤ x < 0.1, system_s[1] , 0.1 ≤ x < 0.2,
    system_s[2] , 0.2 ≤ x < 0.3, system_s[3] , 0.3 ≤ x < 0.4,
    system_s[4] , 0.4 ≤ x < 0.5, system_s[5] , 0.5 ≤ x < 0.6,
    system_s[6] , 0.6 ≤ x < 0.7, system_s[7] , 0.7 ≤ x < 0.8,
    system_s[8] , 0.8 ≤ x < 0.9, system_s[9] , 0.9 ≤ x ≤ 1.0 ,
    system_s[10] , 0) ;
```

```
return spline_3;
```

```
end proc;
```

```
#step := 0.1;
```

```
#f := x →  $\frac{1}{1 + 25x^2}$ ;
```

```
#f := x → x2;
```

```
#f := x → (sin(x) + cos(x)) $\frac{3}{4}$ ;
```

```
#x_ := [0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10];
```

```
x_ := [0, 0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9, 1.0];
```

```
f_t := x → x2;
```

```
xs := [seq([x_[i], f_t(x_[i])], i = 1 .. 11) ] ;
```

```
spline3 := CubicSplineInterpolation_(xs) ;
```

```
plot([f_t(x), CubicSplineInterpolation_(xs)(x)] , x = 0 .. 1, color
    = [red, blue] );
```

```
ReferenceCubicSpline := CubicSpline(xs, independentvar = z);
```

```
Draw(ReferenceCubicSpline);
```

#построенный график кубического сплайна совпадает со сплайном из стандартной библиотеки maple.

```
spline3_sub := proc(f, b)
```

```
local q1;
```

```
q1 := subs(x = b, spline3(f)(x));
```

```
return eval(q1);
```

```
end proc;
```

```

checkCubicSpline := proc(func)
local zero_one_grid, j, deviations, sp, i, smaller_xs_grid, k, diff;
    smaller_xs_grid, smaller_ys_grid, positive_difference;
zero_one_grid := seq(j, j = 0 .. 1, 0.1);
deviations := Array([ ]);
sp := x → spline(x);
for i from 2 to 11 do
smaller_xs_grid := [seq(k, k = zero_one_grid[i - 1]
    .. zero_one_grid[i], 0.01)];
diff := x → abs(func(x) - spline3_sub(func, x));
deviations := Append(deviations, max(map(diff, smaller_xs_grid)));
end do;
return deviations;
end proc;

```

```

f2 := x →  $\frac{1}{1 + 25 x^2}$ ;
xs := [seq([x_[i], f2(x_[i])], i = 1..11) ];
spline3 := CubicSplineInterpolation_(xs) ;
#testVal:=subs(x=0.75, spline3(x)):simplify(testVal);
plot([f2(x), CubicSplineInterpolation_(xs)(x)] , x=0..1, color=[red,
    blue] );
#В статье "The Runge phenomenon and spatially variable shape
parameters in RBF interpolation" by Bengt Fornberg
and Julia Zuev" говорится

```

```

#про функцию Рунге, и её интерполяцию. Феномен Рунге заключается в
том, что функция f(x)
=  $\frac{1}{25 x^2 + 1}$  осциллирует с большой частотой на краях
# отрезка. Но как мы видим на графике, на краях отрезка [0,
1] эта функция не осциллирует,
и её получилось достаточно точно приблизить с
#помощью кубического сплайна.
spline3 := CubicSplineInterpolation_(xs) ;
deviation := max(checkCubicSpline(f));

#судя по значению отклонения, функцию Рунге приближает весьма
неплохо

```

```

f3 := x → (sin(x) + cos(x)) $\frac{3}{4}$ ;
xs := [seq([x_[i], f3(x_[i])], i = 1..11) ];
spline3 := CubicSplineInterpolation_(xs) ;
plot([f3(x), CubicSplineInterpolation_(xs)(x)] , x=0..1, color=[red,
blue] );

```

#В статье "Cubic Spline Interpolation" by Sky McKinley and Megan Levine приводится пример приближения тригонометрической

#функции $(\sin(x) + \cos(x))^{\frac{3}{4}}$. Как видно из графика, её действительно можно хорошо приблизить с помощью кубического сплайна

```

BSplineInterpolation := proc(f)
  segment := 0..1;
  h := 0.1;
  n := 12;
  eps := 10-9;

  xs := [-2·eps, -eps, seq(i, i = segment, h), 1 + eps, 1 + 2·eps];
  ys := [f(0), f(0), seq(f(i), i = segment, h), f(1), f(1)];
  lam := j → piecewise(
    j = 1, f(xs[1]), 1 < j < n,  $\frac{1}{2} \left( -f(xs[j+1]) \right.$ 
    +  $4 \cdot f\left(\frac{xs[j+1] + xs[j+2]}{2}\right) - f(xs[j+2])$ 
     $\left. \right)$ , j = n,
    f(xs[n+1])
  );
  B0 := (i, x) → piecewise(xs[i] ≤ x < xs[i+1], 1, 0);
  B1 := (i, x) →  $\frac{x - xs[i]}{xs[i+1] - xs[i]} \cdot B0(i, x) + \frac{xs[i+2] - x}{xs[i+2] - xs[i+1]} \cdot B0(i$ 
    + 1, x);
  B2 := (i, x) →  $\frac{x - xs[i]}{xs[i+2] - xs[i]} \cdot B1(i, x) + \frac{xs[i+3] - x}{xs[i+3] - xs[i+1]} \cdot B1(i + 1,$ 
    x);
  P := x → sum(lam(i) · B2(i, x), i = 1..n);
  return P;
end proc;

f4 := x → sin(52 x);
splineB := BSplineInterpolation(f4) ;

```

```
plot([f4(x), BSplineInterpolation(f4)(x) ], x = 0..1, color=[red,
blue]);
```

#В-сплайны плохо подходят для приближения тригонометрических функций с большими коэффициентами перед x. Об этом говорится в статье # "Quadratic B-Spline Curve Interpolation " by Fuhua Cheng, Xuefu Wang and B. A Barsky", и действительно, это утверждение подтверждается

#графиком построенного приближения.

```
splineB := BSplineInterpolation(f2) ;
plot([f2(x), BSplineInterpolation(f2)(x) ], x = 0..1, color=[red,
blue]);
```

#Попробую приблизить функцию из первого примера для кубических сплайнов В-сплайном. Как видно из графика, В-сплайн даже лучше смог #приблизить функцию Рунге, подозреваю, что это

#произошло по причине того, что набор базисных функций для квадратичного b-сплайна представляет из себя набор парабол, и они лучше подходят #для приближения функций подобного рода.

0

```
CubicSplineInterpolation_ := proc(points)
```

```
local n, h, vars_c, i, system_c, j, M, c, a_params, d_params, b_params, system_s, spline_3;
```

```
n := numelems(points) - 1;
```

```
h := 0.1;
```

```
vars_c := [seq(c[i], i = 1 .. n + 1)];
```

```
system_c := [c[1] = 0];
```

```
for i from 2 to n + 1 do
```

```
if i = n + 1 then
```

```
system_c := [seq(system_c[j], j = 1 .. i - 1), c[i] = 0]
```

```
else
```

```
system_c := [seq(system_c[j], j = 1 .. i - 1), c[i - 1] * h + 4 * h * c[i] + c[i + 1] * h = 6  
* (points[i + 1, 2] - points[i, 2]) / h - 6 * (points[i, 2] - points[i - 1, 2]) / h]
```

```
end if
```

```
end do;
```

```
M := LinearAlgebra:-GenerateMatrix(system_c, vars_c, augmented = true);
```

```
c := LinearAlgebra:-LinearSolve(M);
```

```

a_params := seq(points[i, 2], i = 2..n + 1);
d_params := seq((c[i] - c[i - 1]) / h, i = 2..n + 1);
b_params := seq((points[i, 2] - points[i - 1, 2]) / h + 1/3 * h * c[i] + 1/6 * c[i - 1] * h, i = 2
..n + 1);
system_s := seq(a_params[i] + b_params[i] * (x - points[i + 1, 1]) + 1/2 * c[i + 1]
* (x - points[i + 1, 1])^2 + 1/6 * d_params[i] * (x - points[i + 1, 1])^3, i = 1..n);
spline_3 := piecewise(0 <= x and x < 0.1, system_s[1], 0.1 <= x and x < 0.2, system_s[2], 0.2
<= x and x < 0.3, system_s[3], 0.3 <= x and x < 0.4, system_s[4], 0.4 <= x and x < 0.5,
system_s[5], 0.5 <= x and x < 0.6, system_s[6], 0.6 <= x and x < 0.7, system_s[7], 0.7 <= x
and x < 0.8, system_s[8], 0.8 <= x and x < 0.9, system_s[9], 0.9 <= x and x <= 1.0, system_s
[10], 0);
return spline_3

```

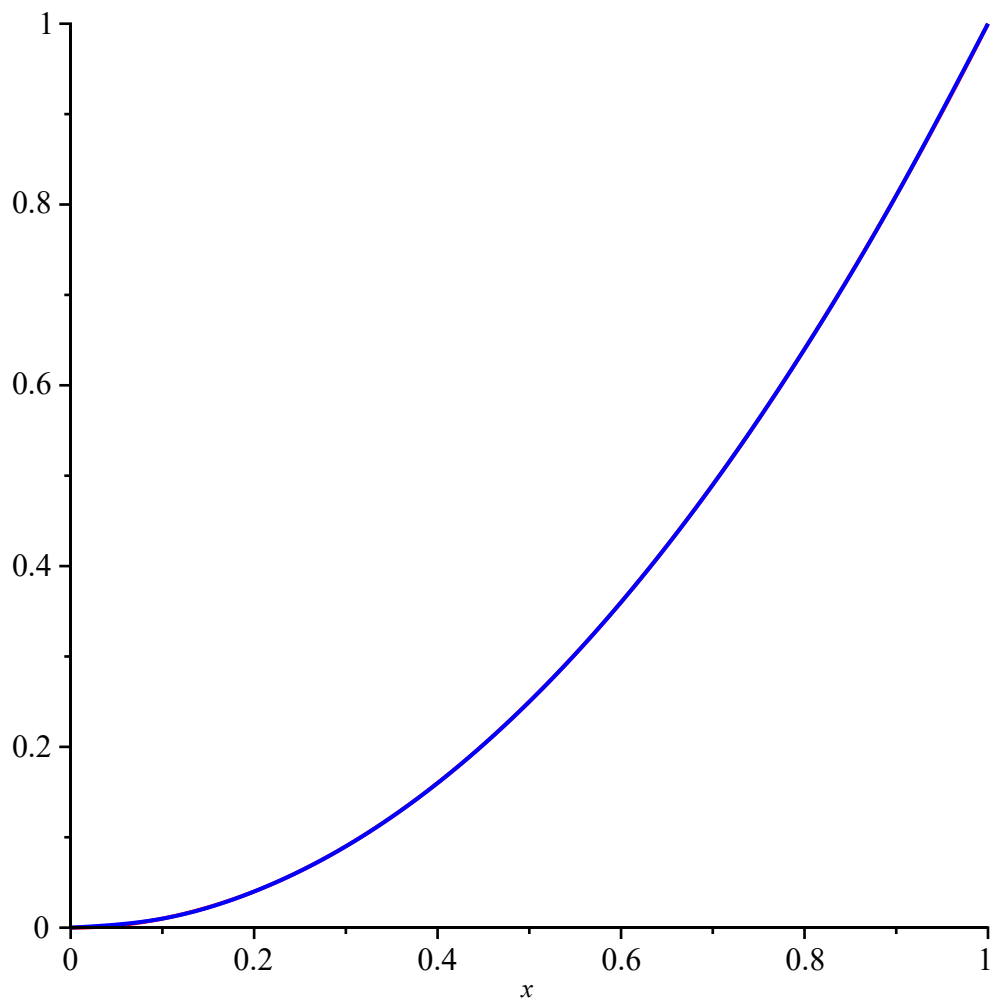
end proc

$x_ := [0, 0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9, 1.0]$

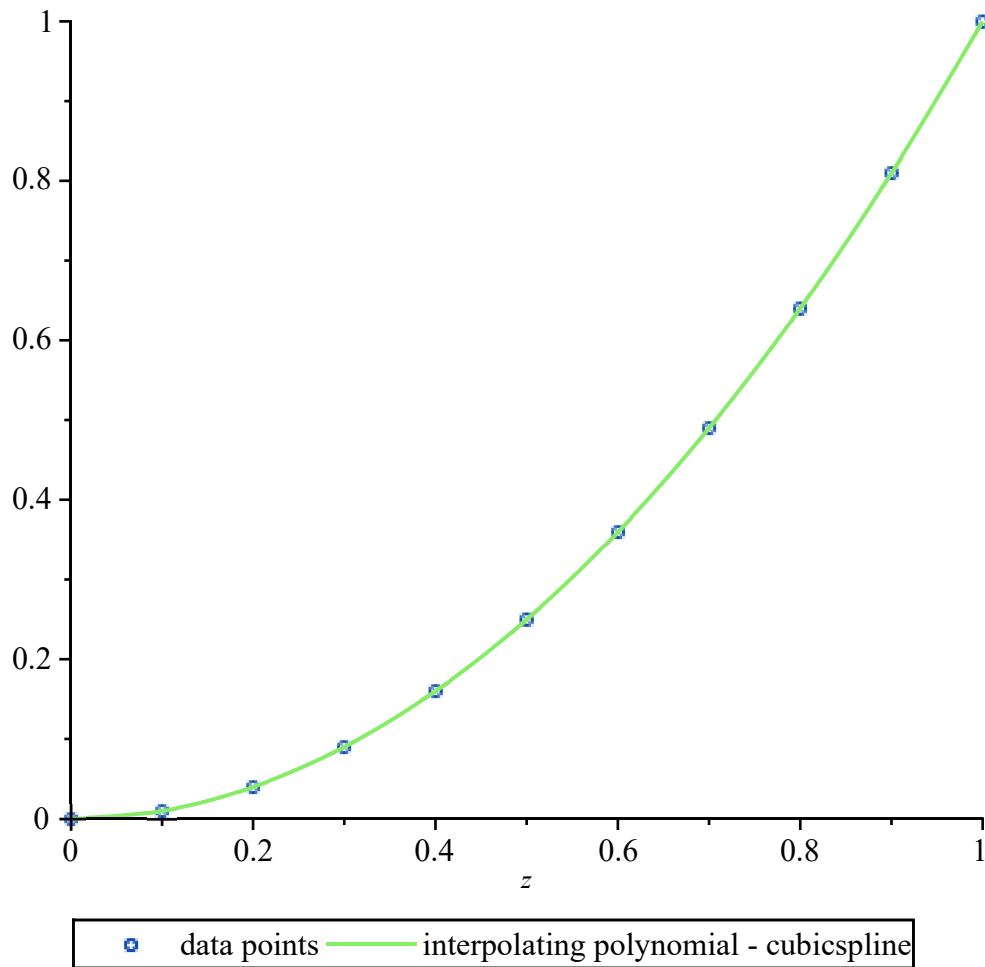
$f_t := x \mapsto x^2$

$xs := [[0, 0], [0.1, 0.01], [0.2, 0.04], [0.3, 0.09], [0.4, 0.16], [0.5, 0.25], [0.6, 0.36], [0.7, 0.49],$
 $[0.8, 0.64], [0.9, 0.81], [1.0, 1.00]]$

$spline3 := \left\{ \begin{array}{l} -0.00845303867403315 + 0.184530386740332 x + 1.26795580110497 (x - 0.1)^2 + 4.22651933701657 (x - 0.1)^3 \\ -0.0408287292817680 + 0.404143646408840 x + 0.928176795580110 (x - 0.2)^2 - 1.13259668501371 (x - 0.2)^3 \\ -0.0896685082872928 + 0.598895027624309 x + 1.01933701657459 (x - 0.3)^2 + 0.303867403370166 (x - 0.3)^3 \\ -0.160110497237569 + 0.800276243093923 x + 0.994475138121547 (x - 0.4)^2 - 0.08287292817680 (x - 0.4)^3 \\ -0.250000000000000 + 1. x + 1.00276243093923 (x - 0.5)^2 + 0.0276243093922649 (x - 0.5)^3 \\ -0.359834254143646 + 1.19972375690608 x + 0.994475138121547 (x - 0.6)^2 - 0.0276243093922649 (x - 0.6)^3 \\ -0.490773480662983 + 1.40110497237569 x + 1.01933701657459 (x - 0.7)^2 + 0.08287292817680 (x - 0.7)^3 \\ -0.636685082872928 + 1.59585635359116 x + 0.928176795580110 (x - 0.8)^2 - 0.303867403370166 (x - 0.8)^3 \\ -0.823922651933702 + 1.81546961325967 x + 1.26795580110497 (x - 0.9)^2 + 1.13259668501371 (x - 0.9)^3 \\ -0.942265193370166 + 1.94226519337017 x - 4.22651933701657 (x - 1.0)^3 \end{array} \right.$



ReferenceCubicSpline := *POLYINTERP*($[[0, 0], [0.1, 0.01], [0.2, 0.04], [0.3, 0.09], [0.4, 0.16],$
 $[0.5, 0.25], [0.6, 0.36], [0.7, 0.49], [0.8, 0.64], [0.9, 0.81], [1.0, 1.00]]$, *independentvar* = z ,
INFO)



Cubic spline interpolation with natural boundary conditions.

```

spline3_sub := proc(f, b) local q1; q1 := subs(x=b, spline3(f)(x)); return eval(q1) end proc

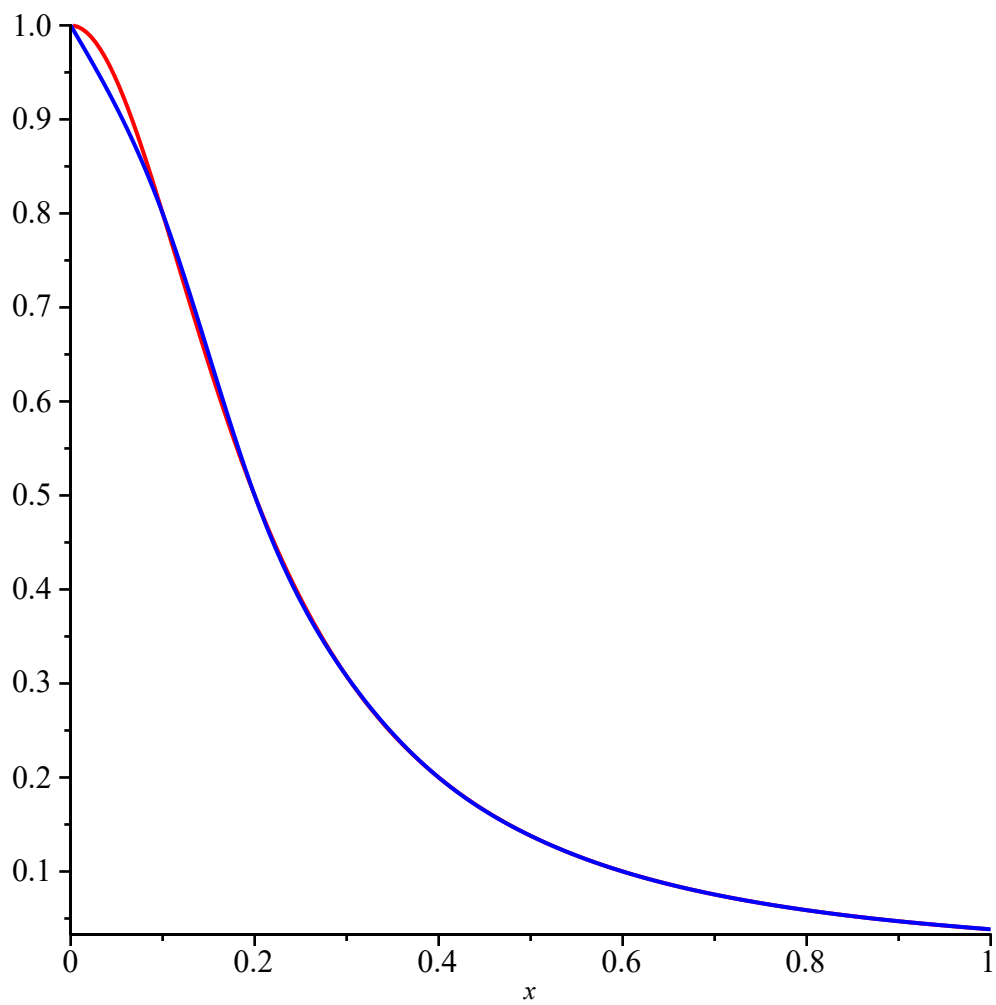
checkCubicSpline := proc(func)
  local zero_one_grid, j, deviations, sp, i, smaller_xs_grid, k, diff;
  smaller_xs_grid, smaller_ys_grid, positive_difference;
  zero_one_grid := seq(j, j=0..1, 0.1);
  deviations := Array([ ]);
  sp := x→spline(x);
  for i from 2 to 11 do
    smaller_xs_grid := [seq(k, k=zero_one_grid[i-1]..zero_one_grid[i], 0.01)];
    diff := x→abs(func(x) - spline3_sub(func, x));
    deviations := ArrayTools:-Append(deviations, max(map(diff, smaller_xs_grid)));
  end do;
  return deviations
end proc

```

$$f2 := x \mapsto \frac{1}{1 + 25 \cdot x^2}$$

$xs := [[0, 1], [0.1, 0.8000000000], [0.2, 0.5000000000], [0.3, 0.3076923077], [0.4, 0.2000000000],$
 $[0.5, 0.1379310345], [0.6, 0.1000000000], [0.7, 0.07547169811], [0.8, 0.05882352941], [0.9,$
 $0.04705882353], [1.0, 0.03846153846]]$

$$spline3 := \begin{cases} 1.06621036694889 - 2.66210366948892 x - 9.93155504233383 (x - 0.1)^2 - 33.10518347444 (x - 0.1)^3 \\ 1.03652743135775 - 2.68263715678877 x + 9.72622016933533 (x - 0.2)^2 + 65.52591737223 (x - 0.2)^3 \\ 0.720665849606796 - 1.37657847302265 x + 3.33436666499253 (x - 0.3)^2 - 21.30617834780 (x - 0.3)^3 \\ 0.524419580314912 - 0.811048950787279 x + 2.32092856069455 (x - 0.4)^2 - 3.37812701432 (x - 0.4)^3 \\ 0.373962994247448 - 0.472063919494896 x + 1.06892175222928 (x - 0.5)^2 - 4.17335602821 (x - 0.5)^3 \\ 0.280417222739881 - 0.300695371233136 x + 0.644763730388326 (x - 0.6)^2 - 1.41386007280 (x - 0.6)^3 \\ 0.214725979107460 - 0.198934687139228 x + 0.372843111217413 (x - 0.7)^2 - 0.90640206390 (x - 0.7)^3 \\ 0.169911527791294 - 0.138859997976618 x + 0.227903779742023 (x - 0.8)^2 - 0.48313110491 (x - 0.8)^3 \\ 0.135269226108870 - 0.0980115584209663 x + 0.180580615814494 (x - 0.9)^2 - 0.15774387975 (x - 0.9)^3 \\ 0.118415035299517 - 0.0799534968395169 x - 0.601935386048314 (x - 1.0)^3 \\ 0 \end{cases}$$



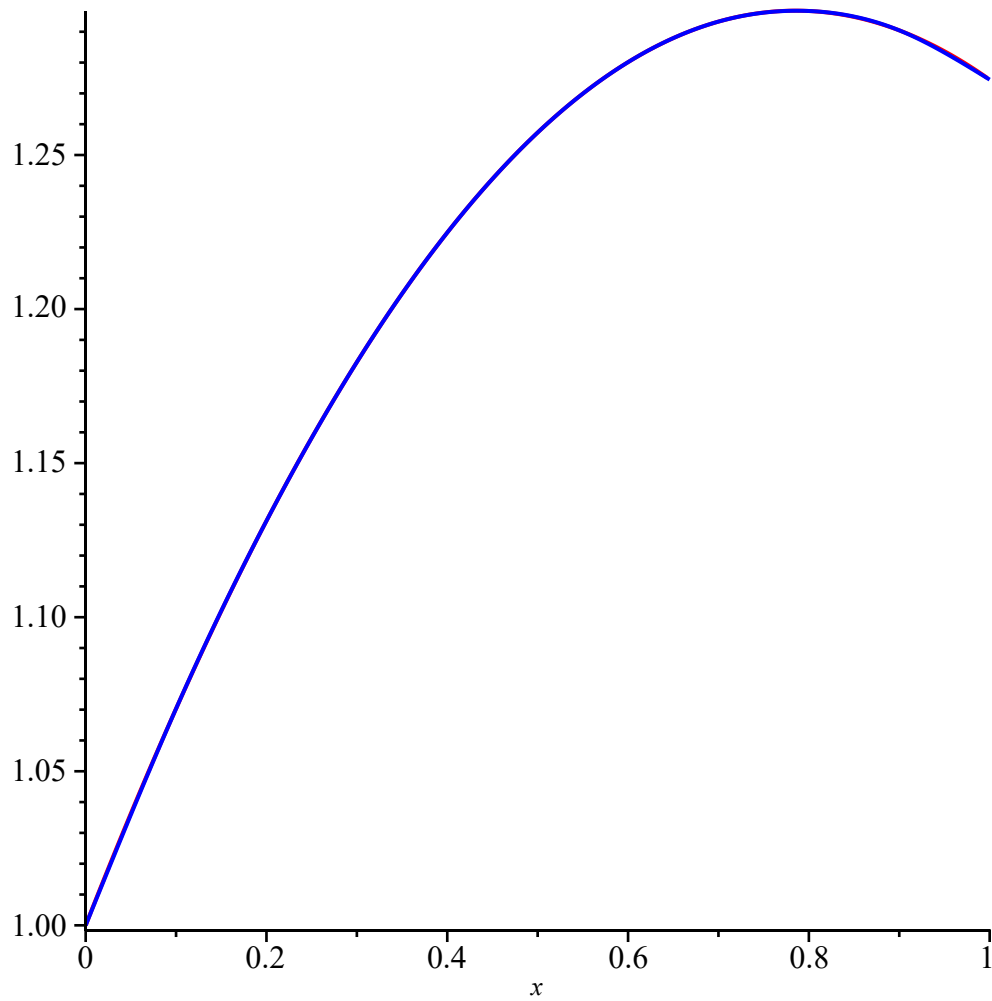
$$\text{spline3} := \left\{ \begin{array}{l}
 1.06621036694889 - 2.66210366948892 x - 9.93155504233383 (x - 0.1)^2 - 33.10518347444 (x - 0.1)^3 \\
 1.03652743135775 - 2.68263715678877 x + 9.72622016933533 (x - 0.2)^2 + 65.52591737223 (x - 0.2)^3 \\
 0.720665849606796 - 1.37657847302265 x + 3.33436666499253 (x - 0.3)^2 - 21.30617834780 (x - 0.3)^3 \\
 0.524419580314912 - 0.811048950787279 x + 2.32092856069455 (x - 0.4)^2 - 3.37812701432 (x - 0.4)^3 \\
 0.373962994247448 - 0.472063919494896 x + 1.06892175222928 (x - 0.5)^2 - 4.17335602821 (x - 0.5)^3 \\
 0.280417222739881 - 0.300695371233136 x + 0.644763730388326 (x - 0.6)^2 - 1.41386007280 (x - 0.6)^3 \\
 0.214725979107460 - 0.198934687139228 x + 0.372843111217413 (x - 0.7)^2 - 0.90640206390 (x - 0.7)^3 \\
 0.169911527791294 - 0.138859997976618 x + 0.227903779742023 (x - 0.8)^2 - 0.48313110491 (x - 0.8)^3 \\
 0.135269226108870 - 0.0980115584209663 x + 0.180580615814494 (x - 0.9)^2 - 0.15774387975 (x - 0.9)^3 \\
 0.118415035299517 - 0.0799534968395169 x - 0.601935386048314 (x - 1.0)^3
 \end{array} \right.$$

$$deviation := 1.$$

$$f3 := x \mapsto (\sin(x) + \cos(x))^3 / 4$$

$$xs := [[0, 1], [0.1, 1.070316628], [0.2, 1.131259881], [0.3, 1.182784619], [0.4, 1.224821026], [0.5, 1.257293962], [0.6, 1.280135571], [0.7, 1.293293473], [0.8, 1.296735866], [0.9, 1.290454241], [1.0, 1.274464067]]$$

$$spline3 := \left\{ \begin{array}{l} 1.00395819307197 + 0.663584349280314 x - 0.593728960795289 (x - 0.1)^2 - 1.97909653598 (x - 0.1)^3 \\ 1.01915952349622 + 0.560501787518901 x - 0.437096656818843 (x - 0.2)^2 + 0.522107679921 (x - 0.2)^3 \\ 1.04225014980678 + 0.468448230644083 x - 0.483438911929340 (x - 0.3)^2 - 0.154474183701 (x - 0.3)^3 \\ 1.07580517003809 + 0.372539639904769 x - 0.475646995463798 (x - 0.4)^2 + 0.025973054885 (x - 0.4)^3 \\ 1.11895721213158 + 0.276673499736842 x - 0.483014406215470 (x - 0.5)^2 - 0.024558035838 (x - 0.5)^3 \\ 1.17201394431128 + 0.180202711147863 x - 0.481693479674324 (x - 0.6)^2 + 0.0044030884704 (x - 0.6)^3 \\ 1.23554278302981 + 0.0825009856717069 x - 0.495323775087235 (x - 0.7)^2 - 0.045434318043 (x - 0.7)^3 \\ 1.30649410906775 - 0.0121978038346903 x - 0.451664119976737 (x - 0.8)^2 + 0.14553218370 (x - 0.8)^3 \\ 1.39745229829965 - 0.118886730332946 x - 0.615225145005816 (x - 0.9)^2 - 0.545203416763 (x - 0.9)^3 \\ 1.45487331183353 - 0.180409244833527 x + 2.05075048335272 (x - 1.0)^3 \\ 0 \end{array} \right.$$



BSplineInterpolation := **proc**(*f*)

local *segment, h, n, eps, xs, i, ys, lam, B0, B1, B2, P;*

segment := 0..1;

h := 0.1;

n := 12;

eps := 1/1000000000;

xs := [-2 * *eps*, -*eps*, seq(*i*, *i* = *segment*, *h*), *eps* + 1, 1 + 2 * *eps*];

ys := [*f*(0), *f*(0), seq(*f*(*i*), *i* = *segment*, *h*), *f*(1), *f*(1)];

lam := *j* → piecewise(*j* = 1, *f*(*xs*[1]), 1 < *j* **and** *j* < *n*, -1/2 * *f*(*xs*[*j* + 1]) + 2 * *f*(1/2 * *xs*[*j* + 1] + 1/2 * *xs*[*j* + 2]) - 1/2 * *f*(*xs*[*j* + 2]), *j* = *n*, *f*(*xs*[*n* + 1]));

B0 := (*i*, *x*) → piecewise(*xs*[*i*] ≤ *x* **and** *x* < *xs*[*i* + 1], 1, 0);

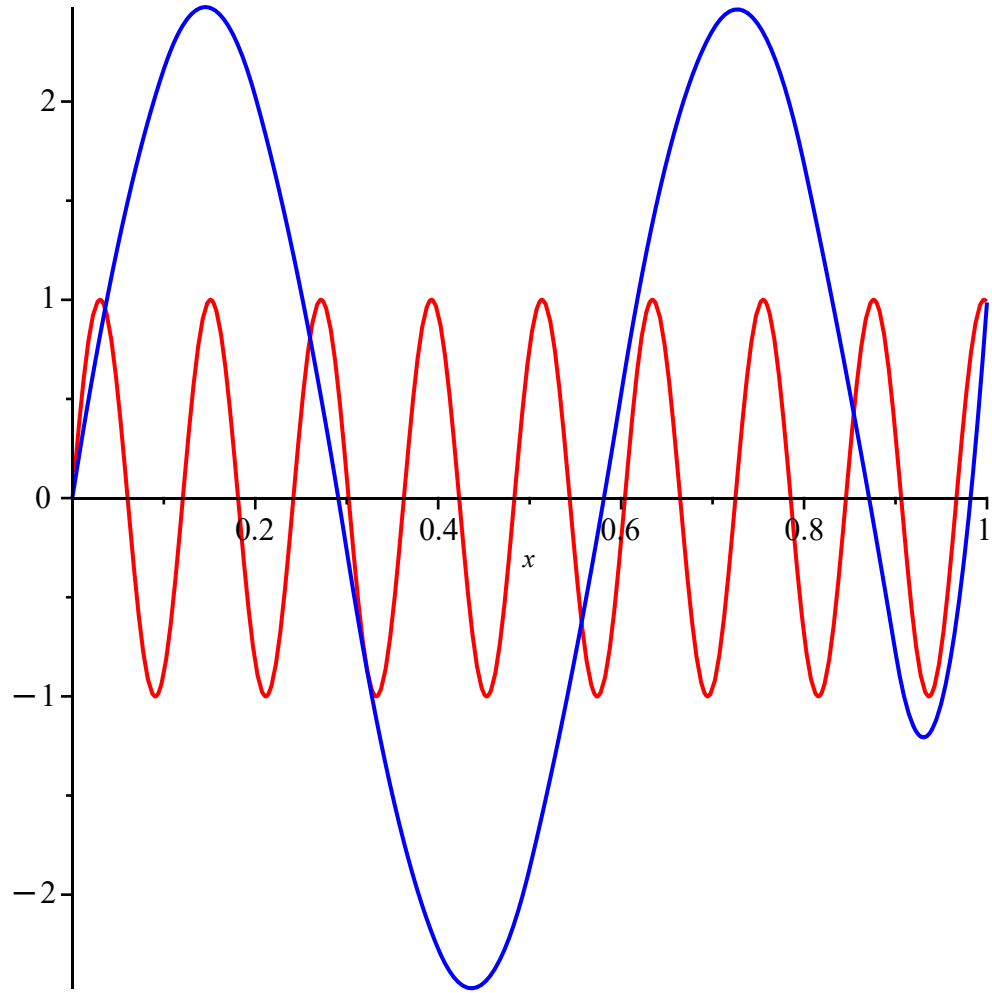
B1 := (*i*, *x*) → (*x* - *xs*[*i*]) * *B0*(*i*, *x*) / (*xs*[*i* + 1] - *xs*[*i*]) + (*xs*[*i* + 2] - *x*) * *B0*(*i* + 1, *x*) / (*xs*[*i* + 2] - *xs*[*i* + 1]);

B2 := (*i*, *x*) → (*x* - *xs*[*i*]) * *B1*(*i*, *x*) / (*xs*[*i* + 2] - *xs*[*i*]) + (*xs*[*i* + 3] - *x*) * *B1*(*i* + 1, *x*) / (*xs*[*i* + 3] - *xs*[*i* + 1]);

P := *x* → sum(*lam*(*i*) * *B2*(*i*, *x*), *i* = 1 .. *n*);

```
return  $P$   
end proc
```

```
 $f4 := x \mapsto \sin(52 \cdot x)$   
 $splineB := P$ 
```



```
 $splineB := P$ 
```

