

```

> [ 0 , 1 ] c 0 . 1 :
> manual_cubic_spline := proc(f, varX)

local i;

local xs := [seq(i, i = 0 .. 1, 0.1)];
local ys := map(f, xs);

local Q1 :=  $x \rightarrow a1 \cdot (x - xs[1])^3 + b1 \cdot (x - xs[1])^2 + c1 \cdot (x - xs[1]) + d1$ ;
local Q2 :=  $x \rightarrow a2 \cdot (x - xs[2])^3 + b2 \cdot (x - xs[2])^2 + c2 \cdot (x - xs[2]) + d2$ ;
local Q3 :=  $x \rightarrow a3 \cdot (x - xs[3])^3 + b3 \cdot (x - xs[3])^2 + c3 \cdot (x - xs[3]) + d3$ ;
local Q4 :=  $x \rightarrow a4 \cdot (x - xs[4])^3 + b4 \cdot (x - xs[4])^2 + c4 \cdot (x - xs[4]) + d4$ ;
local Q5 :=  $x \rightarrow a5 \cdot (x - xs[5])^3 + b5 \cdot (x - xs[5])^2 + c5 \cdot (x - xs[5]) + d5$ ;
local Q6 :=  $x \rightarrow a6 \cdot (x - xs[6])^3 + b6 \cdot (x - xs[6])^2 + c6 \cdot (x - xs[6]) + d6$ ;
local Q7 :=  $x \rightarrow a7 \cdot (x - xs[7])^3 + b7 \cdot (x - xs[7])^2 + c7 \cdot (x - xs[7]) + d7$ ;
local Q8 :=  $x \rightarrow a8 \cdot (x - xs[8])^3 + b8 \cdot (x - xs[8])^2 + c8 \cdot (x - xs[8]) + d8$ ;
local Q9 :=  $x \rightarrow a9 \cdot (x - xs[9])^3 + b9 \cdot (x - xs[9])^2 + c9 \cdot (x - xs[9]) + d9$ ;
local Q10 :=  $x \rightarrow a10 \cdot (x - xs[10])^3 + b10 \cdot (x - xs[10])^2 + c10 \cdot (x - xs[10]) + d10$ ;

local dQ1 := diff(Q1(x), x);
local dQ2 := diff(Q2(x), x);
local dQ3 := diff(Q3(x), x);
local dQ4 := diff(Q4(x), x);
local dQ5 := diff(Q5(x), x);
local dQ6 := diff(Q6(x), x);
local dQ7 := diff(Q7(x), x);
local dQ8 := diff(Q8(x), x);
local dQ9 := diff(Q9(x), x);
local dQ10 := diff(Q10(x), x);

local d2Q1 := diff(dQ1, x);
local d2Q2 := diff(dQ2, x);
local d2Q3 := diff(dQ3, x);
local d2Q4 := diff(dQ4, x);
local d2Q5 := diff(dQ5, x);
local d2Q6 := diff(dQ6, x);
local d2Q7 := diff(dQ7, x);
local d2Q8 := diff(dQ8, x);
local d2Q9 := diff(dQ9, x);
local d2Q10 := diff(dQ10, x);

local eq1 := Q1(xs[1]) = ys[1];
local eq2 := Q1(xs[2]) = ys[2];
local eq3 := Q2(xs[2]) = ys[2];
local eq4 := Q2(xs[3]) = ys[3];
local eq5 := Q3(xs[3]) = ys[3];

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local eq6 := Q3(xs[4]) = ys[4];
local eq7 := Q4(xs[4]) = ys[4];
local eq8 := Q4(xs[5]) = ys[5];
local eq9 := Q5(xs[5]) = ys[5];
local eq10 := Q5(xs[6]) = ys[6];
local eq11 := Q6(xs[6]) = ys[6];
local eq12 := Q6(xs[7]) = ys[7];
local eq13 := Q7(xs[7]) = ys[7];
local eq14 := Q7(xs[8]) = ys[8];
local eq15 := Q8(xs[8]) = ys[8];
local eq16 := Q8(xs[9]) = ys[9];
local eq17 := Q9(xs[9]) = ys[9];
local eq18 := Q9(xs[10]) = ys[10];
local eq19 := Q10(xs[10]) = ys[10];
local eq20 := Q10(xs[11]) = ys[11];

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local eq21 := subs(x = xs[2], dQ1) = subs(x = xs[2], dQ2);
local eq22 := subs(x = xs[3], dQ2) = subs(x = xs[3], dQ3);
local eq23 := subs(x = xs[4], dQ3) = subs(x = xs[4], dQ4);
local eq24 := subs(x = xs[5], dQ4) = subs(x = xs[5], dQ5);
local eq25 := subs(x = xs[6], dQ5) = subs(x = xs[6], dQ6);
local eq26 := subs(x = xs[7], dQ6) = subs(x = xs[7], dQ7);
local eq27 := subs(x = xs[8], dQ7) = subs(x = xs[8], dQ8);
local eq28 := subs(x = xs[9], dQ8) = subs(x = xs[9], dQ9);
local eq29 := subs(x = xs[10], dQ9) = subs(x = xs[10], dQ10);

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local eq30 := subs(x = xs[2], d2Q1) = subs(x = xs[2], d2Q2);
local eq31 := subs(x = xs[3], d2Q2) = subs(x = xs[3], d2Q3);
local eq32 := subs(x = xs[4], d2Q3) = subs(x = xs[4], d2Q4);
local eq33 := subs(x = xs[5], d2Q4) = subs(x = xs[5], d2Q5);
local eq34 := subs(x = xs[6], d2Q5) = subs(x = xs[6], d2Q6);
local eq35 := subs(x = xs[7], d2Q6) = subs(x = xs[7], d2Q7);
local eq36 := subs(x = xs[8], d2Q7) = subs(x = xs[8], d2Q8);
local eq37 := subs(x = xs[9], d2Q8) = subs(x = xs[9], d2Q9);
local eq38 := subs(x = xs[10], d2Q9) = subs(x = xs[10], d2Q10);

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local eq39 := subs(x = xs[1], d2Q1) = 0;
local eq40 := subs(x = xs[11], d2Q10) = 0;

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local coefficients := solve( {eq1, eq2, eq3, eq4, eq5, eq6, eq7, eq8, eq9, eq10, eq11, eq12, eq13,
    eq14, eq15, eq16, eq17, eq18, eq19, eq20, eq21, eq22, eq23, eq24, eq25, eq26, eq27, eq28,
    eq29, eq30, eq31, eq32, eq33, eq34, eq35, eq36, eq37, eq38, eq39, eq40}, {a1, a2, a3, a4,
    a5, a6, a7, a8, a9, a10, b1, b1, b2, b3, b4, b5, b6, b7, b8, b9, b10, c1, c2, c3, c4, c5, c6, c7,
    c8, c9, c10, d1, d2, d3, d4, d5, d6, d7, d8, d9, d10});

```

```

local cubic_splines := piecewise(0 ≤ varX and varX ≤ 0.1, Q1(varX), 0.1 < varX and varX
    ≤ 0.2, Q2(varX), 0.2 < varX and varX ≤ 0.3, Q3(varX), 0.3 < varX and varX ≤ 0.4,
    Q4(varX), 0.4 < varX and varX ≤ 0.5, Q5(varX), 0.5 < varX and varX ≤ 0.6,

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$Q6(varX), 0.6 < varX \text{ and } varX \leq 0.7, Q7(varX), 0.7 < varX \text{ and } varX \leq 0.8,$
 $Q8(varX), 0.8 < varX \text{ and } varX \leq 0.9, Q9(varX), 0.9 < varX \text{ and } varX \leq 1,$
 $Q10(varX), 0);$

return *subs(coefficients, cubic_splines);*

end proc

manual_cubic_spline := **proc**(*f, varX*)

(1)

local *i, xs, ys, Q1, Q2, Q3, Q4, Q5, Q6, Q7, Q8, Q9, Q10, dQ1, dQ2, dQ3, dQ4, dQ5, dQ6, dQ7, dQ8, dQ9, dQ10, d2Q1, d2Q2, d2Q3, d2Q4, d2Q5, d2Q6, d2Q7, d2Q8, d2Q9, d2Q10, eq1, eq2, eq3, eq4, eq5, eq6, eq7, eq8, eq9, eq10, eq11, eq12, eq13, eq14, eq15, eq16, eq17, eq18, eq19, eq20, eq21, eq22, eq23, eq24, eq25, eq26, eq27, eq28, eq29, eq30, eq31, eq32, eq33, eq34, eq35, eq36, eq37, eq38, eq39, eq40, coefficients, cubic_splines;*

xs := [*seq*(*i, i* = 0 .. 1, 0.1)];

ys := *map*(*f, xs*);

Q1 := $x \rightarrow a1 * (x - xs[1])^3 + b1 * (x - xs[1])^2 + c1 * (x - xs[1]) + d1;$

Q2 := $x \rightarrow a2 * (x - xs[2])^3 + b2 * (x - xs[2])^2 + c2 * (x - xs[2]) + d2;$

Q3 := $x \rightarrow a3 * (x - xs[3])^3 + b3 * (x - xs[3])^2 + c3 * (x - xs[3]) + d3;$

Q4 := $x \rightarrow a4 * (x - xs[4])^3 + b4 * (x - xs[4])^2 + c4 * (x - xs[4]) + d4;$

Q5 := $x \rightarrow a5 * (x - xs[5])^3 + b5 * (x - xs[5])^2 + c5 * (x - xs[5]) + d5;$

Q6 := $x \rightarrow a6 * (x - xs[6])^3 + b6 * (x - xs[6])^2 + c6 * (x - xs[6]) + d6;$

Q7 := $x \rightarrow a7 * (x - xs[7])^3 + b7 * (x - xs[7])^2 + c7 * (x - xs[7]) + d7;$

Q8 := $x \rightarrow a8 * (x - xs[8])^3 + b8 * (x - xs[8])^2 + c8 * (x - xs[8]) + d8;$

Q9 := $x \rightarrow a9 * (x - xs[9])^3 + b9 * (x - xs[9])^2 + c9 * (x - xs[9]) + d9;$

Q10 := $x \rightarrow a10 * (x - xs[10])^3 + b10 * (x - xs[10])^2 + c10 * (x - xs[10]) + d10;$

dQ1 := *diff*(*Q1*(*x*), *x*);

dQ2 := *diff*(*Q2*(*x*), *x*);

dQ3 := *diff*(*Q3*(*x*), *x*);

dQ4 := *diff*(*Q4*(*x*), *x*);

dQ5 := *diff*(*Q5*(*x*), *x*);

dQ6 := *diff*(*Q6*(*x*), *x*);

dQ7 := *diff*(*Q7*(*x*), *x*);

dQ8 := *diff*(*Q8*(*x*), *x*);

dQ9 := *diff*(*Q9*(*x*), *x*);

dQ10 := *diff*(*Q10*(*x*), *x*);

d2Q1 := *diff*(*dQ1*, *x*);

d2Q2 := *diff*(*dQ2*, *x*);

d2Q3 := *diff*(*dQ3*, *x*);

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d2Q4 := diff(dQ4, x);
d2Q5 := diff(dQ5, x);
d2Q6 := diff(dQ6, x);
d2Q7 := diff(dQ7, x);
d2Q8 := diff(dQ8, x);
d2Q9 := diff(dQ9, x);
d2Q10 := diff(dQ10, x);
eq1 := Q1(xs[1]) = ys[1];
eq2 := Q1(xs[2]) = ys[2];
eq3 := Q2(xs[2]) = ys[2];
eq4 := Q2(xs[3]) = ys[3];
eq5 := Q3(xs[3]) = ys[3];
eq6 := Q3(xs[4]) = ys[4];
eq7 := Q4(xs[4]) = ys[4];
eq8 := Q4(xs[5]) = ys[5];
eq9 := Q5(xs[5]) = ys[5];
eq10 := Q5(xs[6]) = ys[6];
eq11 := Q6(xs[6]) = ys[6];
eq12 := Q6(xs[7]) = ys[7];
eq13 := Q7(xs[7]) = ys[7];
eq14 := Q7(xs[8]) = ys[8];
eq15 := Q8(xs[8]) = ys[8];
eq16 := Q8(xs[9]) = ys[9];
eq17 := Q9(xs[9]) = ys[9];
eq18 := Q9(xs[10]) = ys[10];
eq19 := Q10(xs[10]) = ys[10];
eq20 := Q10(xs[11]) = ys[11];
eq21 := subs(x = xs[2], dQ1) = subs(x = xs[2], dQ2);
eq22 := subs(x = xs[3], dQ2) = subs(x = xs[3], dQ3);
eq23 := subs(x = xs[4], dQ3) = subs(x = xs[4], dQ4);
eq24 := subs(x = xs[5], dQ4) = subs(x = xs[5], dQ5);
eq25 := subs(x = xs[6], dQ5) = subs(x = xs[6], dQ6);
eq26 := subs(x = xs[7], dQ6) = subs(x = xs[7], dQ7);
eq27 := subs(x = xs[8], dQ7) = subs(x = xs[8], dQ8);
eq28 := subs(x = xs[9], dQ8) = subs(x = xs[9], dQ9);
eq29 := subs(x = xs[10], dQ9) = subs(x = xs[10], dQ10);
eq30 := subs(x = xs[2], d2Q1) = subs(x = xs[2], d2Q2);
eq31 := subs(x = xs[3], d2Q2) = subs(x = xs[3], d2Q3);

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eq32 := subs(x=xs[4], d2Q3) = subs(x=xs[4], d2Q4);
eq33 := subs(x=xs[5], d2Q4) = subs(x=xs[5], d2Q5);
eq34 := subs(x=xs[6], d2Q5) = subs(x=xs[6], d2Q6);
eq35 := subs(x=xs[7], d2Q6) = subs(x=xs[7], d2Q7);
eq36 := subs(x=xs[8], d2Q7) = subs(x=xs[8], d2Q8);
eq37 := subs(x=xs[9], d2Q8) = subs(x=xs[9], d2Q9);
eq38 := subs(x=xs[10], d2Q9) = subs(x=xs[10], d2Q10);
eq39 := subs(x=xs[1], d2Q1) = 0;
eq40 := subs(x=xs[11], d2Q10) = 0;
coefficients := solve( {eq1, eq2, eq3, eq4, eq5, eq6, eq7, eq8, eq9, eq10, eq11, eq12, eq13, eq14,
eq15, eq16, eq17, eq18, eq19, eq20, eq21, eq22, eq23, eq24, eq25, eq26, eq27, eq28, eq29,
eq30, eq31, eq32, eq33, eq34, eq35, eq36, eq37, eq38, eq39, eq40}, {a1, a10, a2, a3, a4, a5,
a6, a7, a8, a9, b1, b10, b2, b3, b4, b5, b6, b7, b8, b9, c1, c10, c2, c3, c4, c5, c6, c7, c8, c9, d1,
d10, d2, d3, d4, d5, d6, d7, d8, d9});
cubic_splines := piecewise(0 <= varX and varX <= 0.1, Q1(varX), 0.1 < varX and varX
<= 0.2, Q2(varX), 0.2 < varX and varX <= 0.3, Q3(varX), 0.3 < varX and varX <= 0.4,
Q4(varX), 0.4 < varX and varX <= 0.5, Q5(varX), 0.5 < varX and varX <= 0.6,
Q6(varX), 0.6 < varX and varX <= 0.7, Q7(varX), 0.7 < varX and varX <= 0.8,
Q8(varX), 0.8 < varX and varX <= 0.9, Q9(varX), 0.9 < varX and varX <= 1,
Q10(varX), 0);
return subs(coefficients, cubic_splines)

```

end proc

> B - :

```

> manual_b_spline := proc(f, x)
  local i, B, y;
  local EPS := 10^(-8);
  local xs := [-2 * EPS, -EPS, seq(i, i=0..1, 0.1), 1 + EPS, 1 + 2 * EPS];
  local b := [f(0), seq(1/2 * (-f(xs[i + 1]) + 4 * f((xs[i + 1] + xs[i + 2]) / 2) - f(xs[i
+ 2])), i=2..11), f(1)];
  B[0] := (j, x) -> piecewise(xs[j] <= x < xs[j + 1], 1, 0);
  B[1] := (j, x) -> (x - xs[j]) / (xs[j + 1] - xs[j]) * B[0](j, x) + (xs[j + 2] - x) / (xs[j
+ 2] - xs[j + 1]) * B[0](j + 1, x);
  B[2] := (j, x) -> (x - xs[j]) / (xs[j + 2] - xs[j]) * B[1](j, x) + (xs[j + 3] - x) / (xs[j
+ 3] - xs[j + 1]) * B[1](j + 1, x);
  return add(b[i] * B[2](i, x), i=1..12);
end proc:

```

>, u
f 0.01

```

> approximation_test := proc(u, f)
  local x;
  return max(seq(abs(u(x) - f(x)), x=0..1, 0.01));

```

end proc;

approximation_test := **proc**(*u, f*)

(2)

local *x*; **return** *max*(*seq*(*abs*(*u*(*x*) - *f*(*x*)), *x* = 0 .. 1, 0.01))

end proc

>

> ,

" "

> *approximate_and_plot* := **proc**(*f*)

local *i, xs, ys, spline_func, max_diff*;

local *cubic_spline* := *x* → *manual_cubic_spline*(*f, x*);

local *b_spline* := *x* → *manual_b_spline*(*f, x*);

printf("Approximation quality of cubic spline: %f\n", *approximation_test*(*x*
→ *cubic_spline*(*x*), *x* → *f*(*x*)));

printf("Approximation quality of B spline: %f\n", *approximation_test*(*x* → *b_spline*(*x*), *x*
→ *f*(*x*)));

plot([*f*(*x*), *cubic_spline*(*x*), '*b_spline*(*x*)'], *x* = 0 .. 1, *color* = [*blue*, *green*, *red*], *legend*
= ["function f", "cubic spline approximation of f", "B spline approximation of f"]);

end proc;

approximate_and_plot := **proc**(*f*)

(3)

local *i, xs, ys, spline_func, max_diff, cubic_spline, b_spline*;

cubic_spline := *x* → *manual_cubic_spline*(*f, x*);

b_spline := *x* → *manual_b_spline*(*f, x*);

printf("Approximation quality of cubic spline: %f\n", *approximation_test*(*x* → *cubic_spline*(*x*),
x → *f*(*x*)));

printf("Approximation quality of B spline: %f\n", *approximation_test*(*x* → *b_spline*(*x*), *x*
→ *f*(*x*)));

plot([*f*(*x*), *cubic_spline*(*x*), '*b_spline*(*x*)'], *x* = 0 .. 1, *color* = [*blue*, *green*, *red*], *legend*
= ["function f", "cubic spline approximation of f", "B spline approximation of f"])

end proc

> **Процедура, принимающая на вход функцию и рисующая график её приближения,
построенного библиотечным методом кубических сплайнов :**

> *draw_std_cubic_splines* := **proc**(*f*)

local *points, x, std_cubic_spline*;

with(*Student*[*NumericalAnalysis*]);

points := [*seq*([*x*, *f*(*x*)], *x* = 0 .. 1, 0.1)];

std_cubic_spline := *CubicSpline*(*points*, *independentvar* = *x*, *boundaryconditions*

```

    = clamped(0, 1), bc_type = 'natural');
    Draw(std_cubic_spline);
end proc;
draw_std_cubic_splines := proc(f)
    local points, x, std_cubic_spline;
    with(Student[NumericalAnalysis]);
    points := [seq([x, f(x)], x = 0..1, 0.1)];
    std_cubic_spline := Student:-NumericalAnalysis:-CubicSpline(points, independentvar = x,
    boundaryconditions = clamped(0, 1), bc_type = 'natural');
    Student:-NumericalAnalysis:-Draw(std_cubic_spline)

```

(4)

end proc

> Процедура, принимающая на вход функцию и рисующая график её приближения,
построенного библиотечным методом квадратичных B сплайнов

```

> draw_std_B_spline := proc(f)
    local x, eps := 1e-8;
    std_b_spline(y) := CurveFitting[BSplineCurve]([ -2*eps, -eps, seq(x, x = 0..1, 0.1), 1
    + eps, 1 + 2*eps], [f(0), f(0), seq(f(x), x = 0..1, 0.1), f(1), f(1)], y);
    plot([std_b_spline(y)], y = 0..1, color = [red]);

```

end proc;

```

draw_std_B_spline := proc(f)

```

(5)

```

    local x, eps;

```

```

    eps := 1.·10^-8;

```

```

    std_b_spline(y) := CurveFitting[BSplineCurve]([ -2*eps, -eps, seq(x, x = 0..1, 0.1), eps
    + 1, 2*eps + 1], [f(0), f(0), seq(f(x), x = 0..1, 0.1), f(1), f(1)], y);

```

```

    plot([std_b_spline(y)], y = 0..1, color = [red])

```

end proc

```

> , ,

```

```

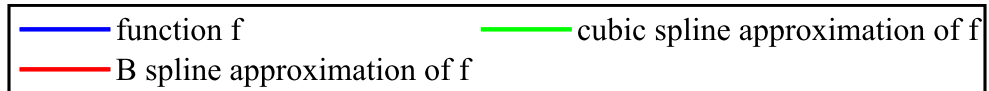
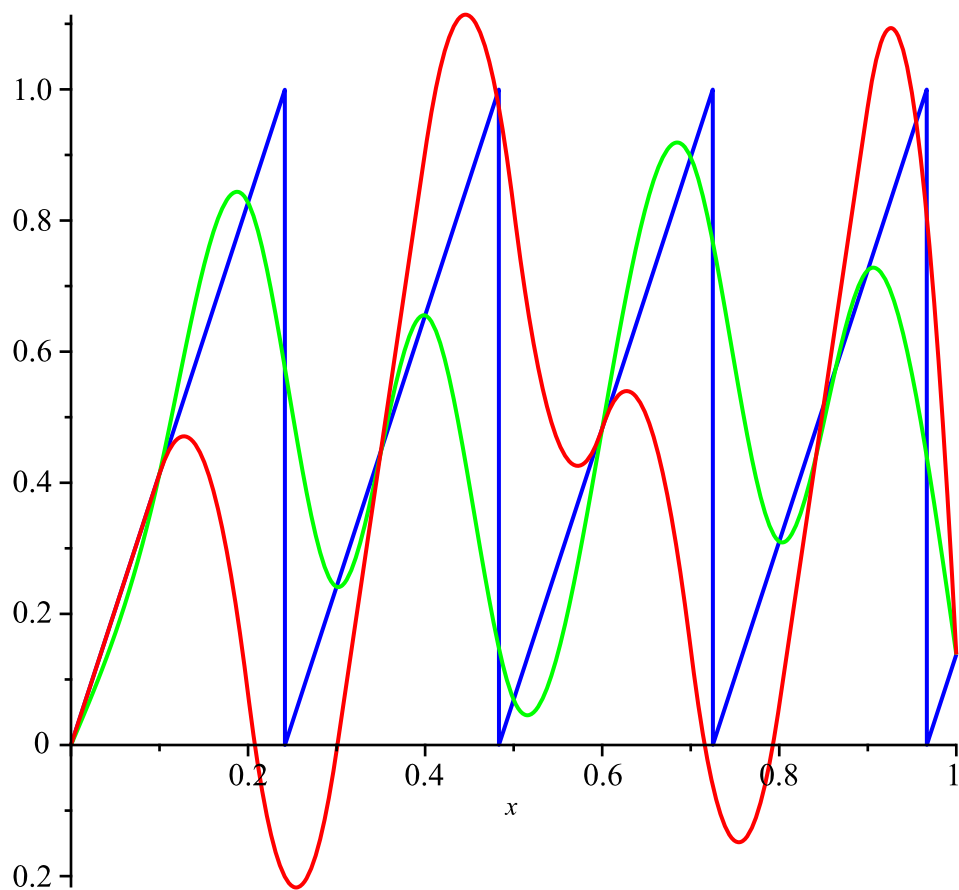
> fraction_f := x → frac( $\frac{13 \cdot x}{\pi}$ );
    approximate_and_plot(fraction_f);

```

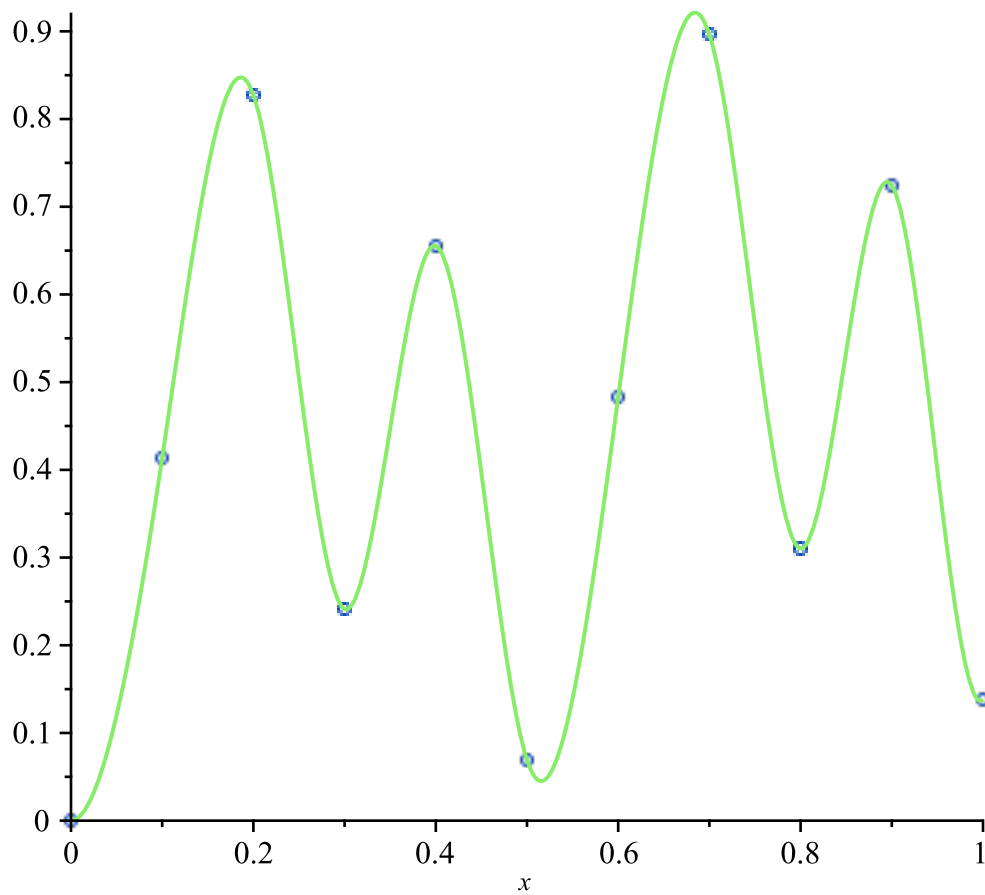
$$fraction_f := x \mapsto \text{frac}\left(\frac{13 \cdot x}{\pi}\right)$$

Approximation quality of cubic spline: 0.817358

Approximation quality of B spline: 1.190000

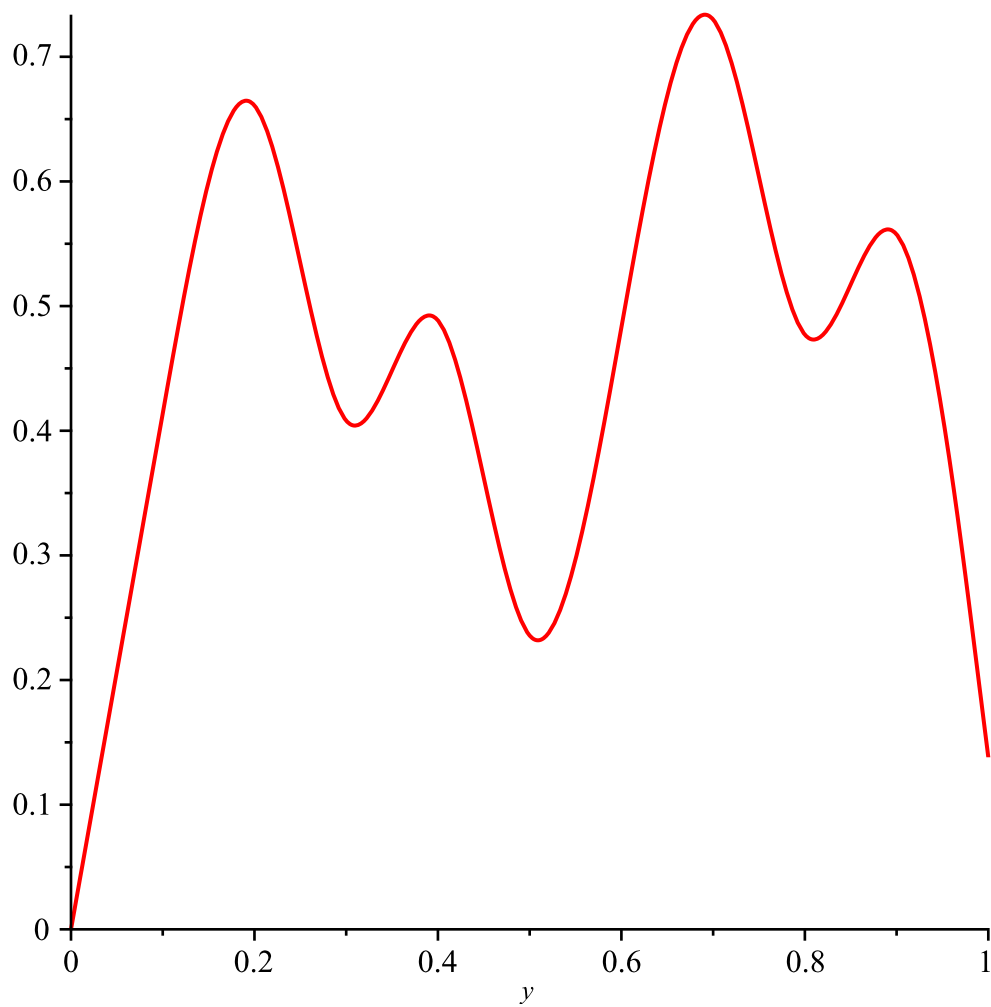


- > *Можно наблюдать полную идентичность библиотечного метода для построения кубических сплайнов и нашего написанного собственными руками :*
- > `draw_std_splines(fraction_f);`



● data points — interpolating polynomial - cubicspline
 Cubic spline interpolation with clamped boundary conditions.

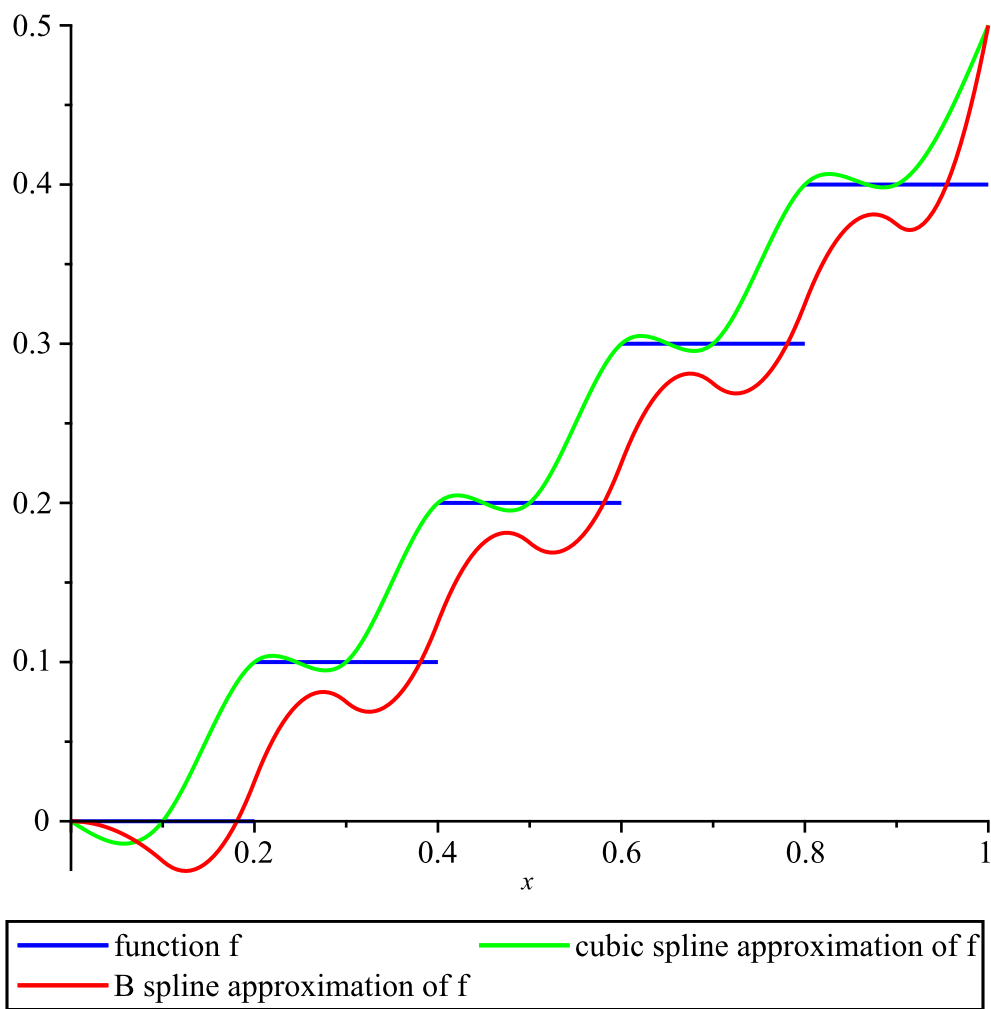
- > *Однако график библиотечного метода для B сплайнов отличается достаточно сильно, ну оно и не удивительно, так как при выборе коэффициентов в этом способе большая свобода :*
- > `draw_std_B_spline(fraction_f);`



```
> staircase_f := x → floor(5 * x) / 10;  
approximate_and_plot(staircase_f);
```

$$\text{staircase_f} := x \mapsto \frac{\lfloor 5 \cdot x \rfloor}{10}$$

Approximation quality of cubic spline: 0.094312
Approximation quality of B spline: 0.075000



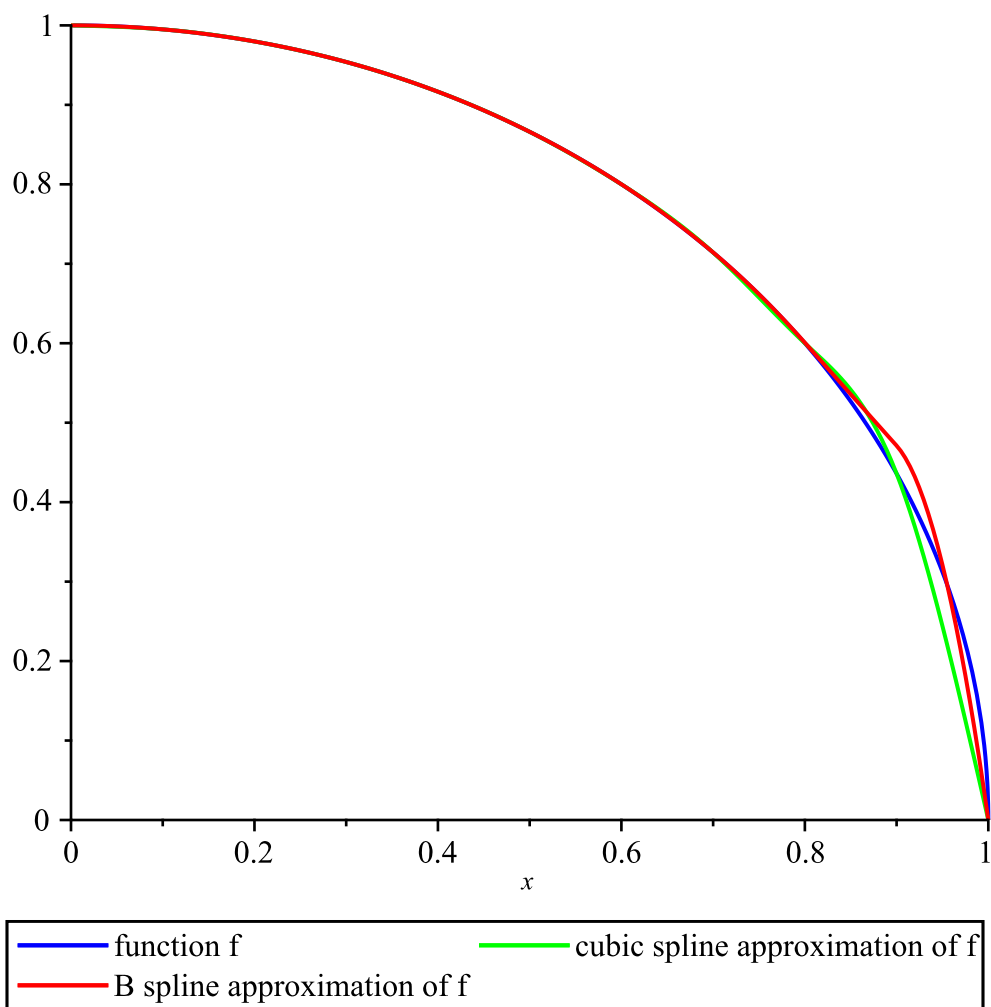
>

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> $half_circle := x \rightarrow \sqrt{1 - x^2}$;
 $approximate_and_plot(half_circle)$;

$half_circle := x \mapsto \sqrt{1 - x^2}$

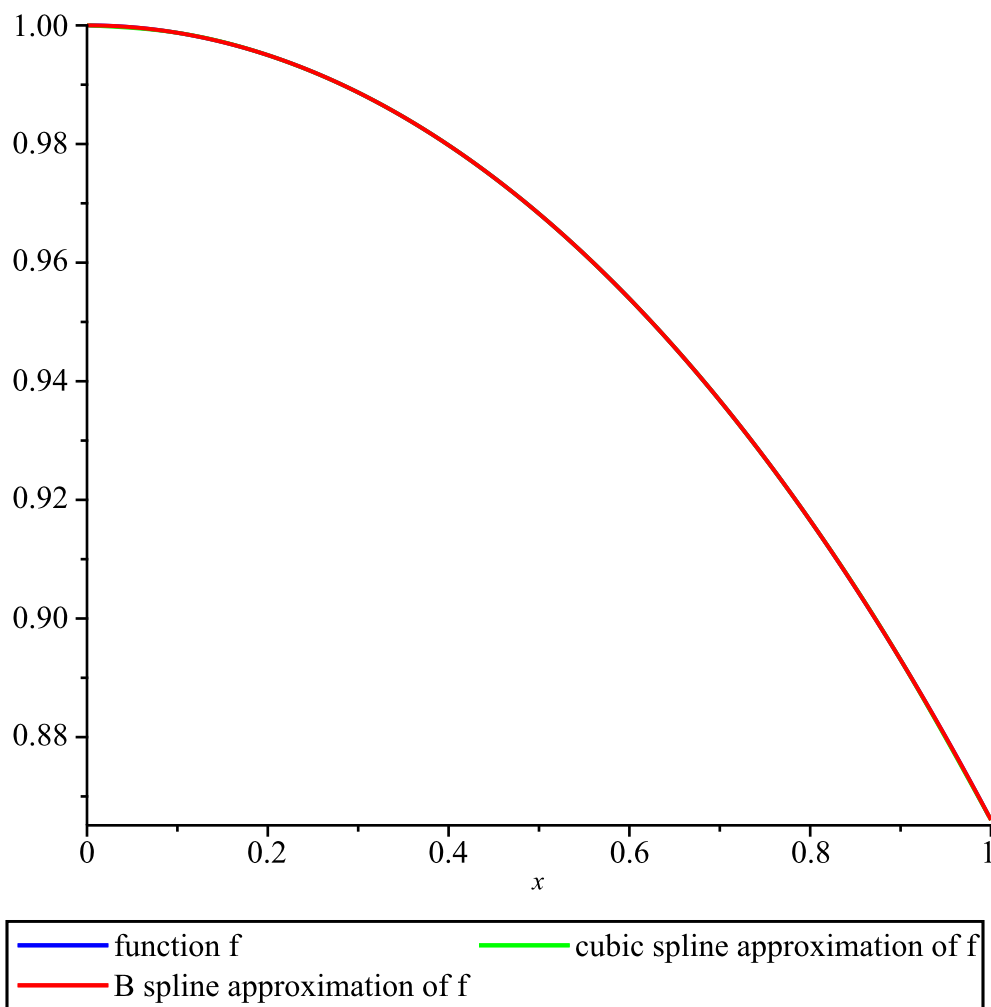
Approximation quality of cubic spline: 0.098438
 Approximation quality of B spline: 0.063177



```
> half_ellipse := x -> sqrt(1 - x^2/4);
approximate_and_plot(half_ellipse);
```

$$half_ellipse := x \mapsto \sqrt{1 - \frac{x^2}{4}}$$

```
Approximation quality of cubic spline: 0.000188
Approximation quality of B spline: 0.000003
```



>

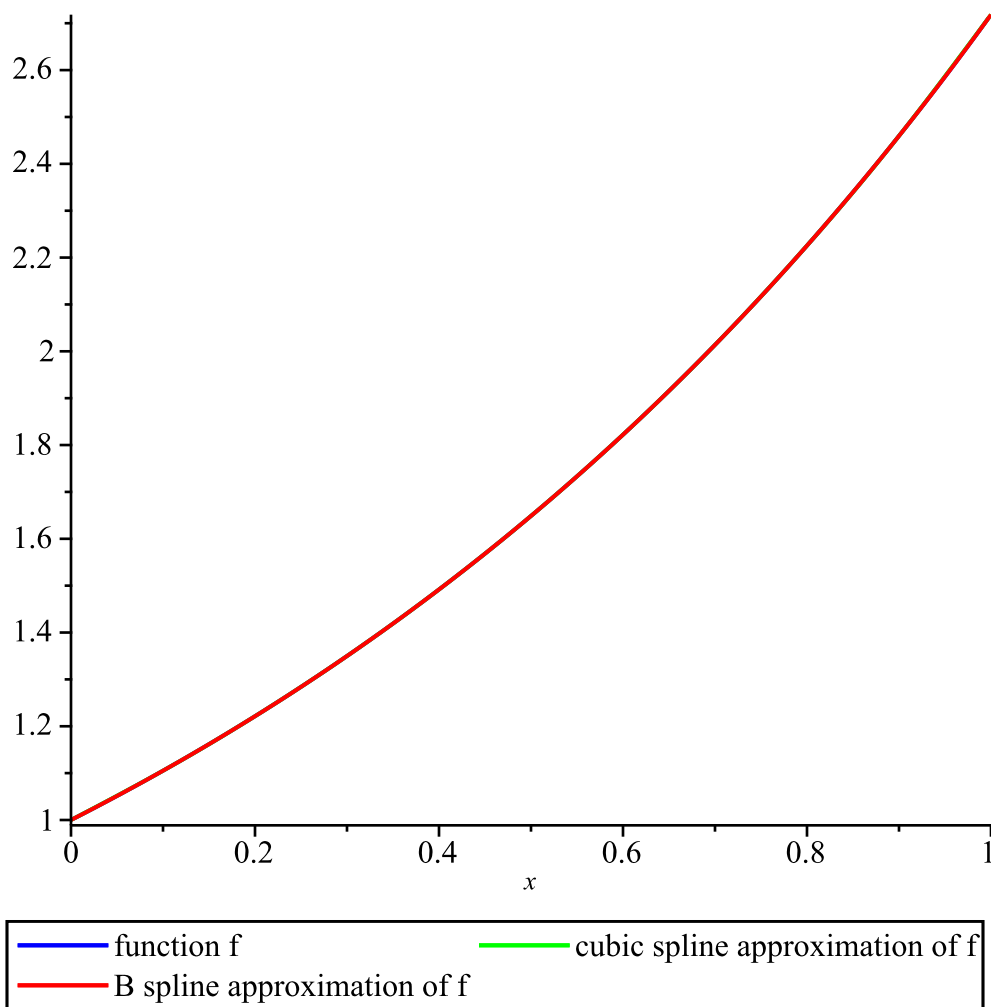
> *Также и экспонента приближается почти идеально обоими сплайнами
· (но B сплайнами совсем хорошо)*

> $exponenta := x \mapsto \exp(x);$
 $approximate_and_plot(exponenta);$

$exponenta := x \mapsto e^x$

Approximation quality of cubic spline: 0.001330

Approximation quality of B spline: 0.000023

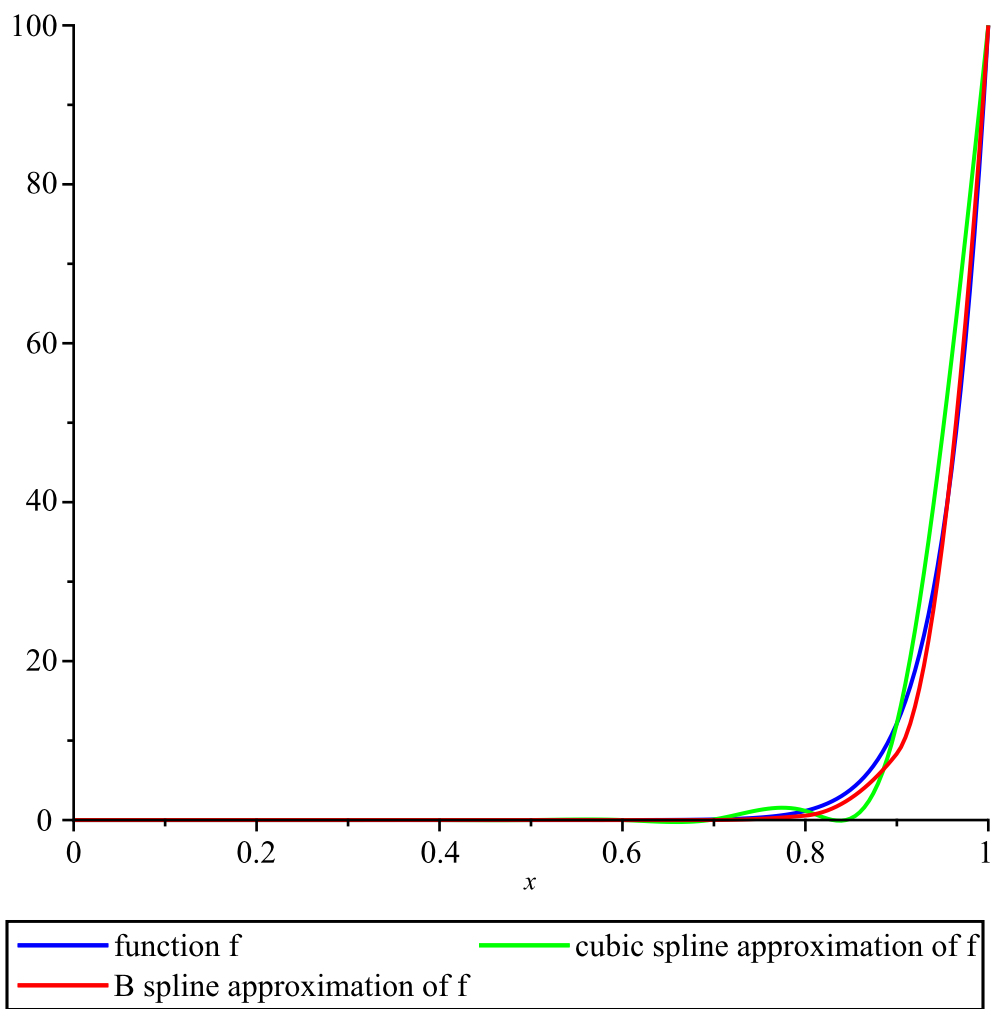


> Также можно пронаблюдать феномен Рунге,
а именно нежелательную осцилляцию на одном из краёв отрезка,
особенно явно эффект выражен для кубических сплайнов

> $f := x \mapsto 100 x^{20}$;
approximate_and_plot(f);

$$f := x \mapsto 100 \cdot x^{20}$$

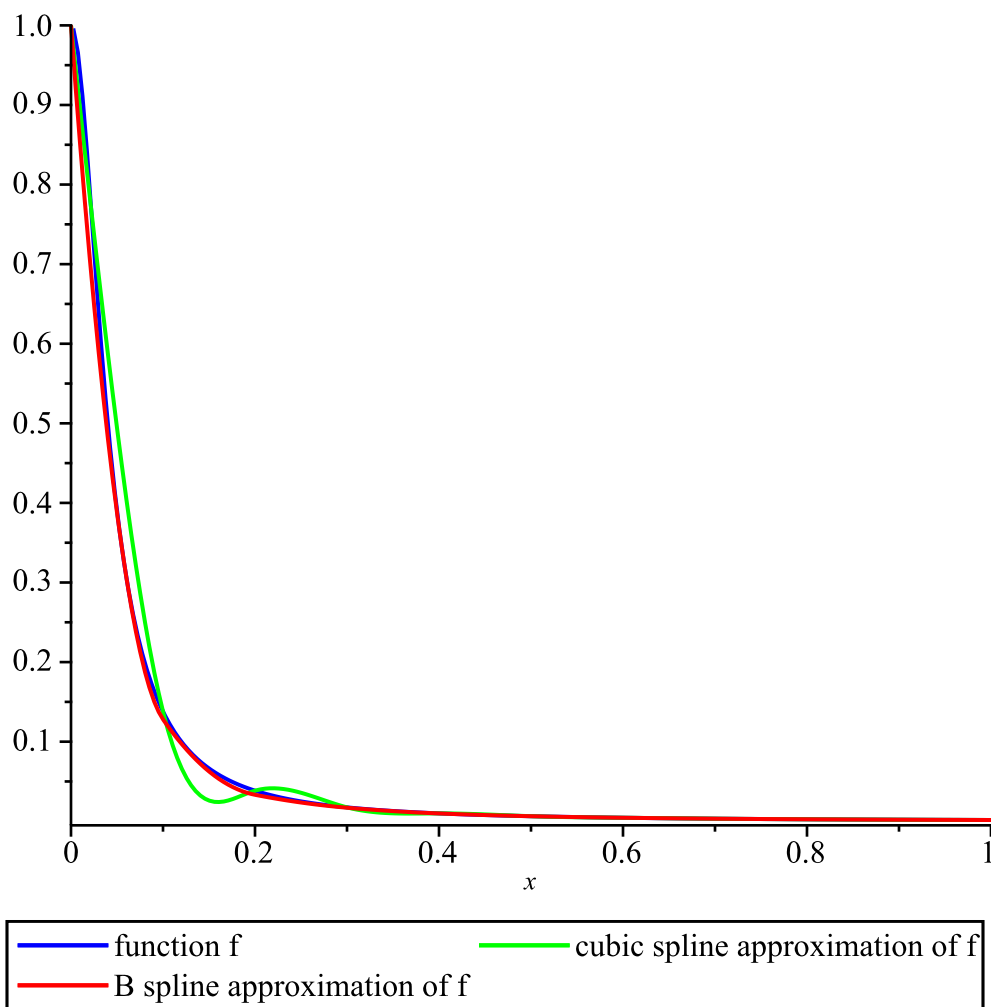
Approximation quality of cubic spline: 13.978330
Approximation quality of B spline: 4.583627



```
> g := x -> 1 / (1 + 625 * x^2);
approximate_and_plot(g);
```

$$g := x \mapsto \frac{1}{1 + 625 \cdot x^2}$$

```
Approximation quality of cubic spline: 0.104118
Approximation quality of B spline: 0.091822
```



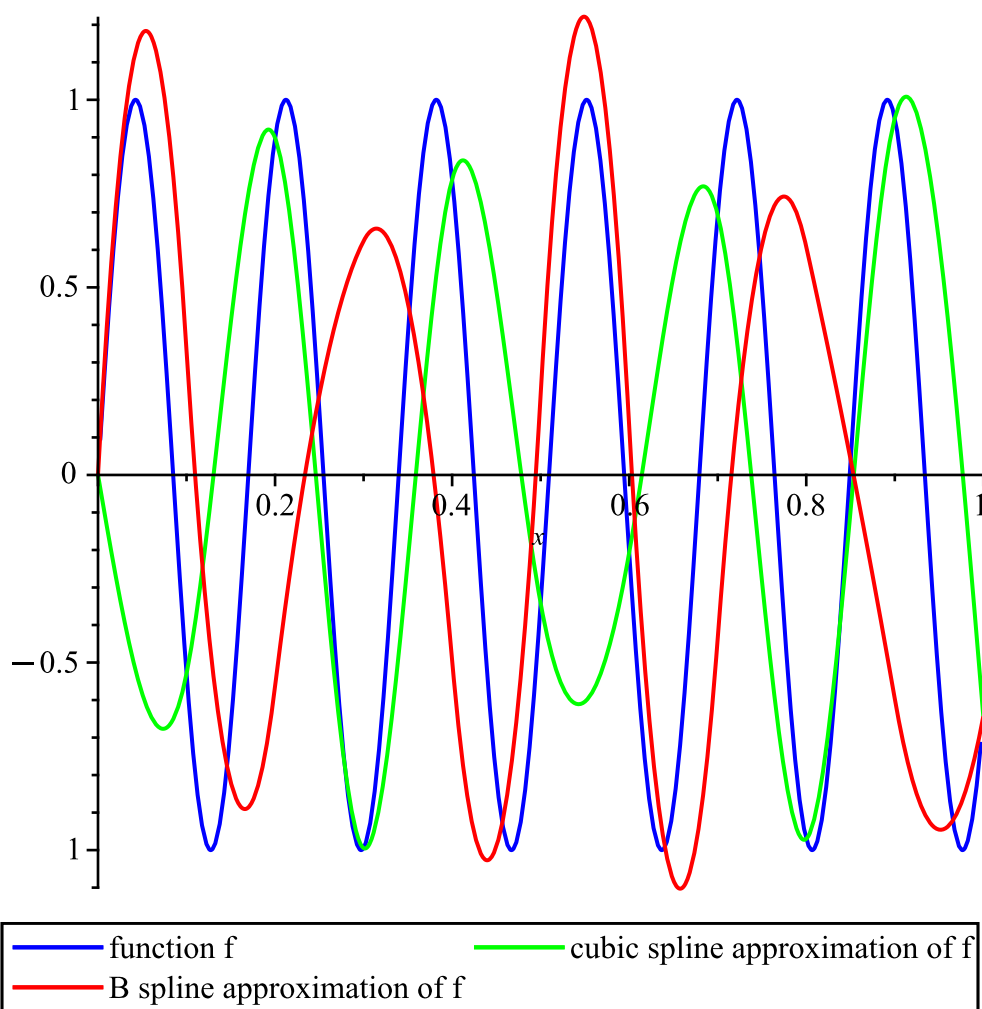
> *Периодические функции со слишком малым периодом приближаются не очень хорошо, так как у нас не слишком частая сетка для функций таких больших частот*

> `sinusoid := x → sin(37 · x);`
`approximate_and_plot(sinusoid);`

`sinusoid := x ↦ sin(37·x)`

Approximation quality of cubic spline: 1.601770

Approximation quality of B spline: 1.618267



> Вдохновение на некоторые примеры было подчерпнуто из статьи : <https://arxiv.org/ftp/arxiv/papers/1601/1601.05132.pdf>