

# Biorthogonal filter pairs:

## Bspline filter pairs and the CDF-7/9 filter pair

### Bspline functions

The Bspline functions are generated by iterated convolution from the box function. Calling the procedure `bspline[N, t]` constructs the first N+1 Bspline functions as piecewise polynomials of degree k ( $0 \leq k \leq N$ )

```
bspline[N_, t_] := Module[{bsp, k, s},
  (*Bspline functions by convolution*)
  bsp[0] = UnitBox[t];
  If[N == 0, Return[{bsp[0]}]];
  Do[
    bsp[k] = Integrate[bsp[k-1] /. (t -> t - s), {s, -1/2, 1/2}],
    {k, 1, N}];
  Return[Table[bsp[k], {k, 0, N}]]
]
```

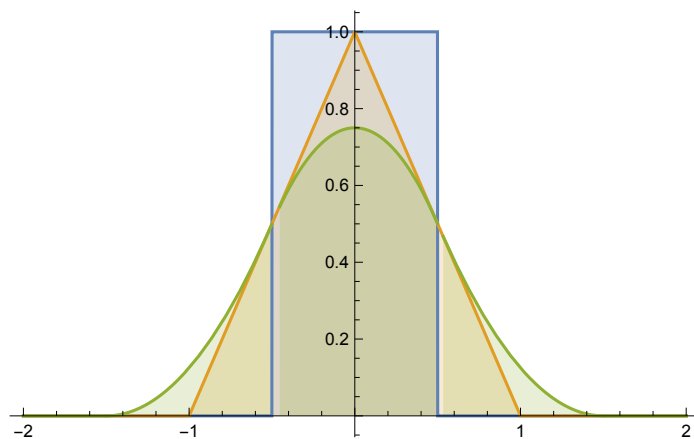
The first 3 Bspline functions as piecewise polynomial functions

```
bspline[2, t]
```

$$\left\{ \text{UnitBox}[t], \begin{cases} 1 & t = 0 \\ 1-t & 0 < t < 1 \\ 1+t & -1 < t < 0 \\ 0 & \text{True} \end{cases}, \begin{cases} \frac{1}{4} (3 - 4 t^2) & -\frac{1}{2} < t < \frac{1}{2} \\ \frac{1}{8} (3 + 4 t - 4 t^2) & t = \frac{1}{2} \\ \frac{1}{8} (9 - 12 t + 4 t^2) & \frac{1}{2} < t < \frac{3}{2} \\ \frac{1}{8} (9 + 12 t + 4 t^2) & -\frac{3}{2} < t \leq -\frac{1}{2} \\ 0 & \text{True} \end{cases} \right\}$$

Plotting the first 3 Bspline functions

```
Plot[%, {t, -2, 2}, Filling -> Axis]
```



Computing the Fourier transform of the first N+1 B-spline functions

```

bsplineft[N_, s_] := Module[{bsp, ft, t},
  (*The Fourier transforms of the B-spline functions*)
  bsp = bspline[N, t];
  ft = Map[FourierTransform[#, t, s, FourierParameters -> {0, -2 Pi}] &, bsp];
  Simplify[ExpToTrig[ft]]
]

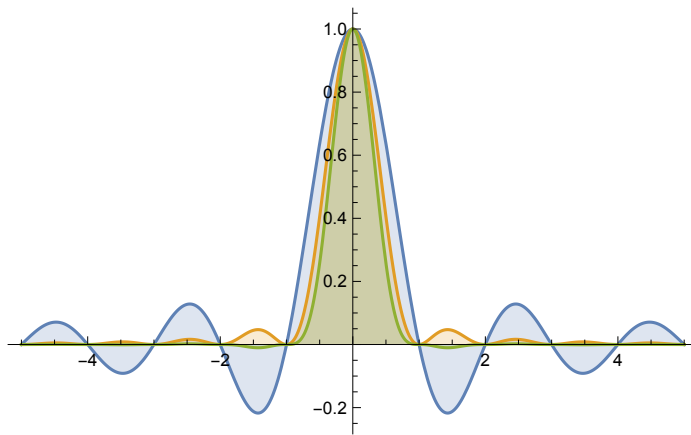
```

The case N=2: iterated convolution means powers for the Fourier transforms

```
bsplineft[2, s]
```

$$\left\{ \text{Sinc}[\pi s], \frac{\text{Sin}[\pi s]^2}{\pi^2 s^2}, \frac{\text{Sin}[\pi s]^3}{\pi^3 s^3} \right\}$$

```
Plot[%, {s, -5, 5}, Filling -> Axis, PlotRange -> All]
```



## Bspline filters

Defining Bspline filters via powers of the cosine -- note the difference between the cases of even and odd N

```
H[N_, w_] := Module[{res},
  (*Frequency representation of the Bspline filters*)
  res = Sqrt[2] Cos[w / 2]^N;
  If[Mod[N, 2] == 1, res = Exp[I w / 2] res];
  Collect[TrigToExp[res], \^0&E
]
```

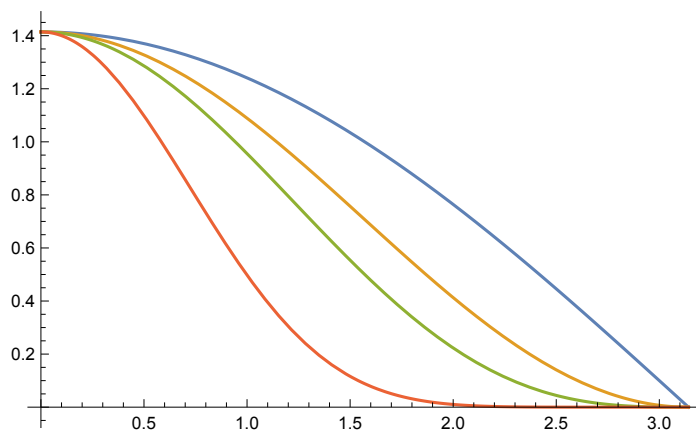
The first 5 Bspline filters -- defining expression and expanded form

```
Table[{N, H[N, w], Expand[H[N, w]]}, {N, 0, 5}] // MatrixForm
```

$$\begin{pmatrix} 0 & \sqrt{2} & \sqrt{2} \\ 1 & \frac{1}{\sqrt{2}} + \frac{e^{i\omega}}{\sqrt{2}} & \frac{1}{\sqrt{2}} + \frac{e^{i\omega}}{\sqrt{2}} \\ 2 & \frac{1}{\sqrt{2}} + \frac{e^{-i\omega}}{2\sqrt{2}} + \frac{e^{i\omega}}{2\sqrt{2}} & \frac{1}{\sqrt{2}} + \frac{e^{-i\omega}}{2\sqrt{2}} + \frac{e^{i\omega}}{2\sqrt{2}} \\ 3 & \frac{e^{\frac{i\omega}{2}} \left( e^{-\frac{i\omega}{2}} + e^{\frac{i\omega}{2}} \right)^3}{4\sqrt{2}} & \frac{3}{4\sqrt{2}} + \frac{e^{-i\omega}}{4\sqrt{2}} + \frac{3e^{i\omega}}{4\sqrt{2}} + \frac{e^{2i\omega}}{4\sqrt{2}} \\ 4 & \frac{\left( e^{-\frac{i\omega}{2}} + e^{\frac{i\omega}{2}} \right)^4}{8\sqrt{2}} & \frac{3}{4\sqrt{2}} + \frac{e^{-i\omega}}{2\sqrt{2}} + \frac{e^{i\omega}}{2\sqrt{2}} + \frac{e^{-2i\omega}}{8\sqrt{2}} + \frac{e^{2i\omega}}{8\sqrt{2}} \\ 5 & \frac{e^{\frac{i\omega}{2}} \left( e^{-\frac{i\omega}{2}} + e^{\frac{i\omega}{2}} \right)^5}{16\sqrt{2}} & \frac{5}{8\sqrt{2}} + \frac{5e^{-i\omega}}{16\sqrt{2}} + \frac{5e^{i\omega}}{8\sqrt{2}} + \frac{e^{-2i\omega}}{16\sqrt{2}} + \frac{5e^{2i\omega}}{16\sqrt{2}} + \frac{e^{3i\omega}}{16\sqrt{2}} \end{pmatrix}$$

Plotting the frequency representation

```
Plot[{Abs[H[1, w]], H[2, w], Abs[H[3, w]], H[8, w]}, {w, 0, Pi}]
```



Showing the sequence of filter coefficients of the B-spline filters

```
h[N_] := Module[{cl, w},
  (*Filter coefficients of the B-spline filters*)
  cl = CoefficientList[
    Expand[H[N, w] Exp[Floor[N/2] I w]], E^(I w)];
  Table[{-Floor[N/2] + k, cl[[k + 1]]}, {k, 0, N}]
]
```

h[2]

$$\left\{ \left\{ -1, \frac{1}{2\sqrt{2}} \right\}, \left\{ 0, \frac{1}{\sqrt{2}} \right\}, \left\{ 1, \frac{1}{2\sqrt{2}} \right\} \right\}$$

h[3]

$$\left\{ \left\{ -1, \frac{1}{4\sqrt{2}} \right\}, \left\{ 0, \frac{3}{4\sqrt{2}} \right\}, \left\{ 1, \frac{3}{4\sqrt{2}} \right\}, \left\{ 2, \frac{1}{4\sqrt{2}} \right\} \right\}$$

h[4]

$$\left\{ \left\{ -2, \frac{1}{8\sqrt{2}} \right\}, \left\{ -1, \frac{1}{2\sqrt{2}} \right\}, \left\{ 0, \frac{3}{4\sqrt{2}} \right\}, \left\{ 1, \frac{1}{2\sqrt{2}} \right\}, \left\{ 2, \frac{1}{8\sqrt{2}} \right\} \right\}$$

## Orthogonal partners of B-spline filters

Defining the Daubechies polynomials

```
Daub[N_, z_] := Sum[Binomial[N + k, k] z^k, {k, 0, N}]
```

Daub[3, z]

$$1 + 4z + 10z^2 + 20z^3$$

Computing the frequency representation of a filter of length  $2M+N-1$  which forms a biorthogonal pair with the B-spline filter of length  $N+1$  by using the construction with Daubechies polynomials

```
K[M_, N_, w_] := Module[{res, n, m},
  (* Frequency representation of biorthogonal filter partners *)
  If[Mod[N - M, 2] != 0, Throw["falsche Parität"]];
  If[Mod[N, 2] == 0,
    n = N / 2;
    m = M / 2;
    res = Sqrt[2] Cos[w / 2]^M Daub[n + m - 1, Sin[w / 2]^2];
  If[Mod[N, 2] == 1,
    n = (N - 1) / 2;
    m = (M - 1) / 2;
    res = Sqrt[2] Exp[I w / 2] Cos[w / 2]^M Daub[n + m, Sin[w / 2]^2];
  Expand[TrigToExp[res]]
]
```

Some examples of biorthogonal partners

**K[1, 1,  $\omega$ ]**

$$\frac{1}{\sqrt{2}} + \frac{e^{i\omega}}{\sqrt{2}}$$

**K[1, 3,  $\omega$ ]**

$$-\frac{1}{2\sqrt{2}} + \sqrt{2} - \frac{e^{-i\omega}}{2\sqrt{2}} - \frac{e^{i\omega}}{2\sqrt{2}} + \sqrt{2} e^{i\omega} - \frac{e^{2i\omega}}{2\sqrt{2}}$$

**K[2, 2,  $\omega$ ]**

$$-\frac{1}{2\sqrt{2}} + \sqrt{2} + \frac{e^{-i\omega}}{2\sqrt{2}} + \frac{e^{i\omega}}{2\sqrt{2}} - \frac{e^{-2i\omega}}{4\sqrt{2}} - \frac{e^{2i\omega}}{4\sqrt{2}}$$

**K[5, 3,  $\omega$ ]**

$$\frac{175}{128\sqrt{2}} - \frac{13 e^{-i\omega}}{128\sqrt{2}} + \frac{175 e^{i\omega}}{128\sqrt{2}} - \frac{97 e^{-2i\omega}}{256\sqrt{2}} - \frac{13 e^{2i\omega}}{128\sqrt{2}} + \frac{19 e^{-3i\omega}}{256\sqrt{2}} - \frac{97 e^{3i\omega}}{256\sqrt{2}} + \frac{15 e^{-4i\omega}}{256\sqrt{2}} + \frac{19 e^{4i\omega}}{256\sqrt{2}} - \frac{5 e^{-5i\omega}}{256\sqrt{2}} + \frac{15 e^{5i\omega}}{256\sqrt{2}} - \frac{5 e^{6i\omega}}{256\sqrt{2}}$$

**K[4, 6,  $\omega$ ]**

$$\frac{987}{256\sqrt{2}} + \frac{63 e^{-i\omega}}{256\sqrt{2}} + \frac{63 e^{i\omega}}{256\sqrt{2}} - \frac{1827 e^{-2i\omega}}{1024\sqrt{2}} - \frac{1827 e^{2i\omega}}{1024\sqrt{2}} + \frac{235 e^{-3i\omega}}{512\sqrt{2}} + \frac{235 e^{3i\omega}}{512\sqrt{2}} + \frac{165 e^{-4i\omega}}{512\sqrt{2}} + \frac{165 e^{4i\omega}}{512\sqrt{2}} - \frac{105 e^{-5i\omega}}{512\sqrt{2}} - \frac{105 e^{5i\omega}}{512\sqrt{2}} + \frac{35 e^{-6i\omega}}{1024\sqrt{2}} + \frac{35 e^{6i\omega}}{1024\sqrt{2}}$$

## Checking the orthogonality condition

The case N=2, M=2

**H[2, ω] Conjugate[K[2, 2, ω]] + H[2, ω + Pi] Conjugate[K[2, 2, ω + Pi]]**

$$\left( \frac{1}{\sqrt{2}} + \frac{e^{-i(\pi+\omega)}}{2\sqrt{2}} + \frac{e^{i(\pi+\omega)}}{2\sqrt{2}} \right) \left( -\frac{1}{2\sqrt{2}} + \sqrt{2} - \frac{e^{-i\text{Conjugate}[\omega]}}{2\sqrt{2}} - \frac{e^{i\text{Conjugate}[\omega]}}{2\sqrt{2}} - \frac{e^{-2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{e^{2i\text{Conjugate}[\omega]}}{4\sqrt{2}} \right) + \left( \frac{1}{\sqrt{2}} + \frac{e^{-i\omega}}{2\sqrt{2}} + \frac{e^{i\omega}}{2\sqrt{2}} \right) \left( -\frac{1}{2\sqrt{2}} + \sqrt{2} + \frac{e^{-i\text{Conjugate}[\omega]}}{2\sqrt{2}} + \frac{e^{i\text{Conjugate}[\omega]}}{2\sqrt{2}} - \frac{e^{-2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{e^{2i\text{Conjugate}[\omega]}}{4\sqrt{2}} \right)$$

**Assuming[ω ∈ Reals, Simplify[%]]**

2

The case N=2, M=4

**H[2, ω] Conjugate[K[4, 2, ω]] + H[2, ω + Pi] Conjugate[K[4, 2, ω + Pi]]**

$$\left( \frac{1}{\sqrt{2}} + \frac{e^{-i\omega}}{2\sqrt{2}} + \frac{e^{i\omega}}{2\sqrt{2}} \right) \left( \frac{45}{32\sqrt{2}} + \frac{19e^{-i\text{Conjugate}[\omega]}}{32\sqrt{2}} + \frac{19e^{i\text{Conjugate}[\omega]}}{32\sqrt{2}} - \frac{e^{-2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{e^{2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{3e^{-3i\text{Conjugate}[\omega]}}{32\sqrt{2}} - \frac{3e^{3i\text{Conjugate}[\omega]}}{32\sqrt{2}} + \frac{3e^{-4i\text{Conjugate}[\omega]}}{64\sqrt{2}} + \frac{3e^{4i\text{Conjugate}[\omega]}}{64\sqrt{2}} \right) + \left( \frac{1}{\sqrt{2}} + \frac{e^{-i(\pi+\omega)}}{2\sqrt{2}} + \frac{e^{i(\pi+\omega)}}{2\sqrt{2}} \right) \left( \frac{45}{32\sqrt{2}} - \frac{19e^{-i\text{Conjugate}[\omega]}}{32\sqrt{2}} - \frac{19e^{i\text{Conjugate}[\omega]}}{32\sqrt{2}} - \frac{e^{-2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{e^{2i\text{Conjugate}[\omega]}}{4\sqrt{2}} + \frac{3e^{-3i\text{Conjugate}[\omega]}}{32\sqrt{2}} + \frac{3e^{3i\text{Conjugate}[\omega]}}{32\sqrt{2}} + \frac{3e^{-4i\text{Conjugate}[\omega]}}{64\sqrt{2}} + \frac{3e^{4i\text{Conjugate}[\omega]}}{64\sqrt{2}} \right)$$

**Assuming[ω ∈ Reals, Simplify[%]]**

2

The case N=4, M=2

**H[4, ω] Conjugate[K[2, 4, ω]] + H[4, ω + Pi] Conjugate[K[2, 4, ω + Pi]]**

$$\frac{1}{8\sqrt{2}} \left( e^{-\frac{1}{2}i(\pi+\omega)} + e^{\frac{1}{2}i(\pi+\omega)} \right)^4 \left( \frac{5}{2\sqrt{2}} - \frac{5 e^{-i \text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{5 e^{i \text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{3 e^{-2i \text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{3 e^{2i \text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{3 e^{-3i \text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{3 e^{3i \text{Conjugate}[\omega]}}{16\sqrt{2}} \right) +$$

$$\frac{1}{8\sqrt{2}} \left( e^{-\frac{i\omega}{2}} + e^{\frac{i\omega}{2}} \right)^4 \left( \frac{5}{2\sqrt{2}} + \frac{5 e^{-i \text{Conjugate}[\omega]}}{16\sqrt{2}} + \frac{5 e^{i \text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{3 e^{-2i \text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{3 e^{2i \text{Conjugate}[\omega]}}{4\sqrt{2}} + \frac{3 e^{-3i \text{Conjugate}[\omega]}}{16\sqrt{2}} + \frac{3 e^{3i \text{Conjugate}[\omega]}}{16\sqrt{2}} \right)$$

**Assuming[ω ∈ Reals, Simplify[%]]**

2

The case N=3, M=1

**H[3, ω] Conjugate[K[1, 3, ω]] + H[3, ω + Pi] Conjugate[K[1, 3, ω + Pi]]**

$$\frac{1}{4\sqrt{2}} e^{\frac{i\omega}{2}} \left( e^{-\frac{i\omega}{2}} + e^{\frac{i\omega}{2}} \right)^3$$

$$\left( -\frac{1}{2\sqrt{2}} + \sqrt{2} - \frac{e^{-i \text{Conjugate}[\omega]}}{2\sqrt{2}} + \sqrt{2} e^{-i \text{Conjugate}[\omega]} - \frac{e^{i \text{Conjugate}[\omega]}}{2\sqrt{2}} - \frac{e^{-2i \text{Conjugate}[\omega]}}{2\sqrt{2}} \right) +$$

$$\left( \frac{3}{4\sqrt{2}} + \frac{e^{-i(\pi+\omega)}}{4\sqrt{2}} + \frac{3 e^{i(\pi+\omega)}}{4\sqrt{2}} + \frac{e^{2i(\pi+\omega)}}{4\sqrt{2}} \right)$$

$$\left( -\frac{1}{2\sqrt{2}} + \sqrt{2} + \frac{e^{-i \text{Conjugate}[\omega]}}{2\sqrt{2}} - \sqrt{2} e^{-i \text{Conjugate}[\omega]} + \frac{e^{i \text{Conjugate}[\omega]}}{2\sqrt{2}} - \frac{e^{-2i \text{Conjugate}[\omega]}}{2\sqrt{2}} \right)$$

**Assuming[ω ∈ Reals, Simplify[%]]**

2

## Filter properties of biorthogonal partners

```

k[M_, N_] := Module[{L},
  (*Filter coefficients of biorthogonal filter partners*)
  L = 2 M + N - 1;
  cl = CoefficientList[
    Expand[Exp[Floor[(L - 1) / 2] I w] TrigToExp[K[M, N, w]]], E^(I w)];
  Table[{-Floor[(L - 1) / 2] + k - 1, cl[[k]]}, {k, 1, L}]
]

```

The case N=3, M=3

```
k[3, 3]
```

$$\left\{ \left\{ -3, \frac{3}{32\sqrt{2}} \right\}, \left\{ -2, -\frac{9}{32\sqrt{2}} \right\}, \left\{ -1, -\frac{7}{32\sqrt{2}} \right\}, \left\{ 0, \frac{45}{32\sqrt{2}} \right\}, \right.$$

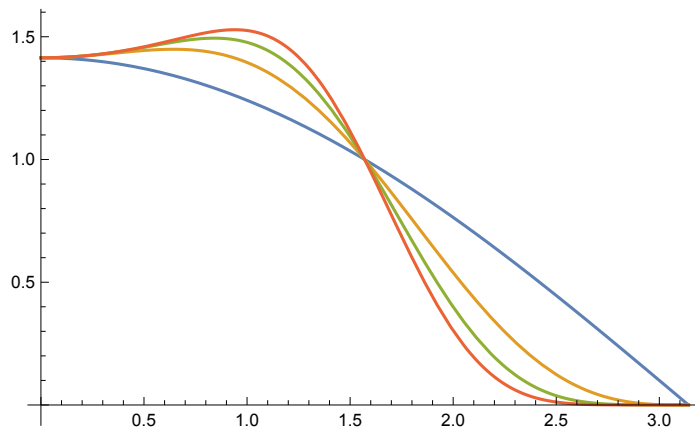
$$\left. \left\{ 1, \frac{45}{32\sqrt{2}} \right\}, \left\{ 2, -\frac{7}{32\sqrt{2}} \right\}, \left\{ 3, -\frac{9}{32\sqrt{2}} \right\}, \left\{ 4, \frac{3}{32\sqrt{2}} \right\} \right\}$$

Plotting the frequency representation: the cases N=1 and M=1,3,5,7

```

Plot[{Abs[K[1, 1, w]], Abs[K[3, 1, w]],
  Abs[K[5, 1, w]], Abs[K[7, 1, w]]}, {w, 0, Pi}]

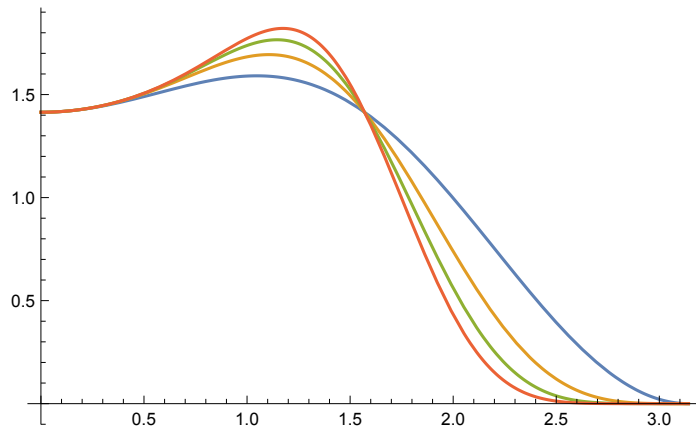
```





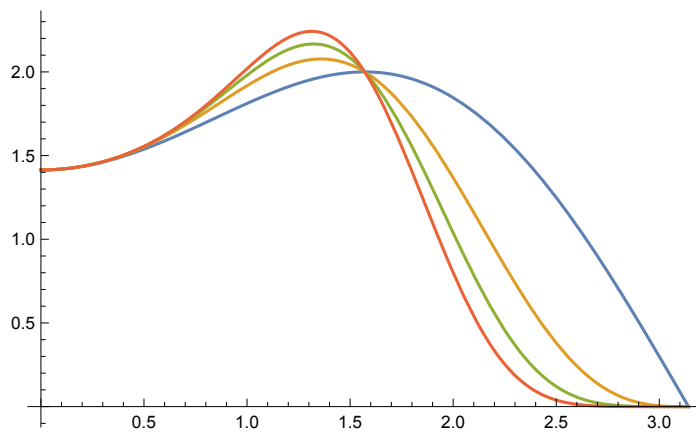
Plotting the frequency representation: the cases  $N=2$  and  $M=2,4,6,8$

```
Plot[{Abs[K[2, 2, w]], Abs[K[4, 2, w]],
     Abs[K[6, 2, w]], Abs[K[8, 2, w]]}, {w, 0, Pi}]
```



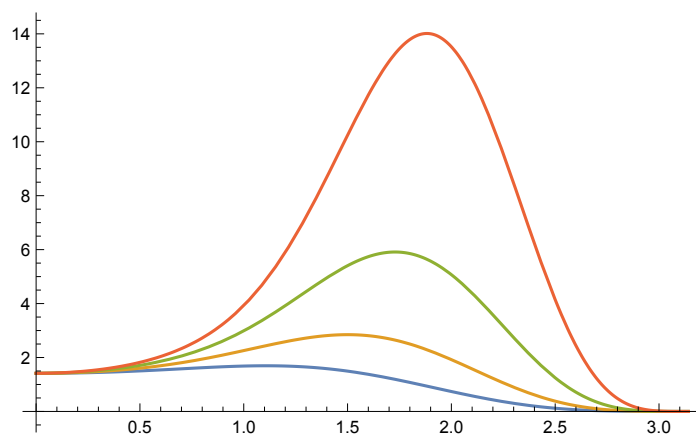
Plotting the frequency representation: the cases  $N=3$  and  $M=1,3,5,7$

```
Plot[{Abs[K[1, 3, w]], Abs[K[3, 3, w]],
     Abs[K[5, 3, w]], Abs[K[7, 3, w]]}, {w, 0, Pi}]
```



Plotting the frequency representation: the cases  $M=4$  and  $N=2,4,6,8$

```
Plot[{Abs[K[4, 2, w]], Abs[K[4, 4, w]],
     Abs[K[4, 6, w]], Abs[K[4, 8, w]]}, {w, 0, Pi}]
```



## A biorthogonal 7/9 filter pair

The B-spline filter coefficients for  $N=6$

**h[6]**

$$\left\{ \left\{ -3, \frac{1}{32\sqrt{2}} \right\}, \left\{ -2, \frac{3}{16\sqrt{2}} \right\}, \left\{ -1, \frac{15}{32\sqrt{2}} \right\}, \right. \\ \left. \left\{ 0, \frac{5}{8\sqrt{2}} \right\}, \left\{ 1, \frac{15}{32\sqrt{2}} \right\}, \left\{ 2, \frac{3}{16\sqrt{2}} \right\}, \left\{ 3, \frac{1}{32\sqrt{2}} \right\} \right\}$$

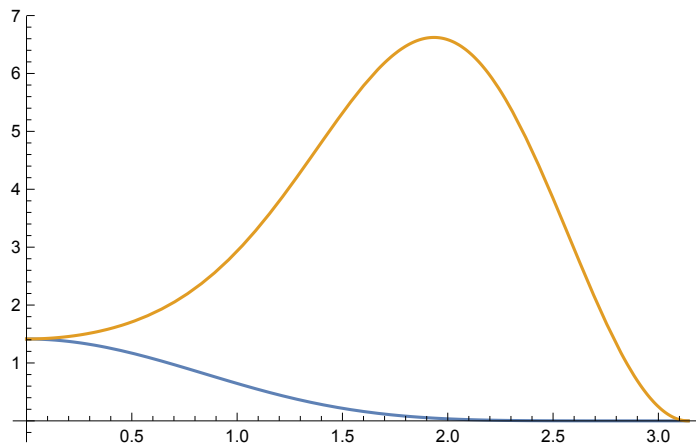
The filter coefficients of the biorthogonal partner with  $M=2$ , so that this filter has length  $2M+N-1=9$

**k[2, 6]**

$$\left\{ \left\{ -4, -\frac{5}{32\sqrt{2}} \right\}, \left\{ -3, \frac{15}{16\sqrt{2}} \right\}, \left\{ -2, -\frac{7}{4\sqrt{2}} \right\}, \left\{ -1, -\frac{7}{16\sqrt{2}} \right\}, \right. \\ \left. \left\{ 0, \frac{77}{16\sqrt{2}} \right\}, \left\{ 1, -\frac{7}{16\sqrt{2}} \right\}, \left\{ 2, -\frac{7}{4\sqrt{2}} \right\}, \left\{ 3, \frac{15}{16\sqrt{2}} \right\}, \left\{ 4, -\frac{5}{32\sqrt{2}} \right\} \right\}$$

Plotting the frequency representation

**Plot[Abs[H[6, w]], K[2, 6, w]], {w, 0, Pi}]**



Checking the orthogonality condition

**H[6, ω] Conjugate[K[2, 6, ω]] + H[6, ω + Pi] Conjugate[K[2, 6, ω + Pi]]**

$$\frac{1}{32\sqrt{2}} \left( e^{-\frac{1}{2}i(\pi+\omega)} + e^{\frac{1}{2}i(\pi+\omega)} \right)^6 \left( \frac{77}{16\sqrt{2}} + \frac{7e^{-i\text{Conjugate}[\omega]}}{16\sqrt{2}} + \frac{7e^{i\text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{7e^{-2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{7e^{2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - (15e^{-3i\text{Conjugate}[\omega]}) / (16\sqrt{2}) - (15e^{3i\text{Conjugate}[\omega]}) / (16\sqrt{2}) - \frac{5e^{-4i\text{Conjugate}[\omega]}}{32\sqrt{2}} - \frac{5e^{4i\text{Conjugate}[\omega]}}{32\sqrt{2}} \right) +$$

$$\frac{1}{32\sqrt{2}} \left( e^{-\frac{i\omega}{2}} + e^{\frac{i\omega}{2}} \right)^6 \left( \frac{77}{16\sqrt{2}} - \frac{7e^{-i\text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{7e^{i\text{Conjugate}[\omega]}}{16\sqrt{2}} - \frac{7e^{-2i\text{Conjugate}[\omega]}}{4\sqrt{2}} - \frac{7e^{2i\text{Conjugate}[\omega]}}{4\sqrt{2}} + (15e^{-3i\text{Conjugate}[\omega]}) / (16\sqrt{2}) + (15e^{3i\text{Conjugate}[\omega]}) / (16\sqrt{2}) - \frac{5e^{-4i\text{Conjugate}[\omega]}}{32\sqrt{2}} - \frac{5e^{4i\text{Conjugate}[\omega]}}{32\sqrt{2}} \right)$$

**Assuming[ω ∈ Reals, Simplify[%]]**

2

Using the cascade algorithm ( $n$  iterations, discrete version) to plot the scaling function belonging to the filter  $h$

```
cascadephidis[h_, n_] :=
Module[{degrees, min, max, sum, hmodif, hpol, hpols, tbl, clist, z},
  (*Approximation of the scaling function belonging
  to the filter h by using the cascade algorithm*)
  degrees = Map[First[#] &, h];
  min = Min[degrees];
  max = Max[degrees];
  sum = Last[Total[h]];
  hmodif = Map[{First[#], Last[#] / sum} &, h];
  hpol := Apply[Plus, Map[Last[#] z^First[#] &, hmodif]];
  hpols := Expand[Product[hpol /. z -> z^(2^t), {t, 0, n-1}]];
  clist = 2^n CoefficientList[z^(-min (2^n - 1)) hpols, z];
  tbl = Table[{(k - 1) 2^(-n), clist[[k]]}, {k, 1, Length[clist]}];
  ListPlot[tbl, PlotRange -> All, Filling -> Axis]
]
```

Using the cascade algorithm ( $n$  iterations, discrete version) to plot the wavelet function belonging to the filter  $h$

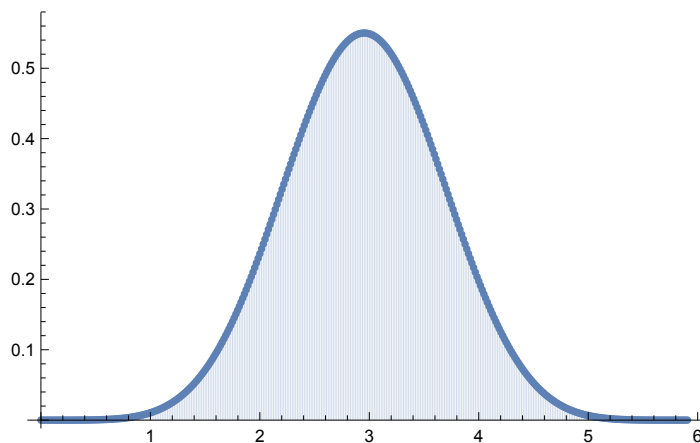
```

cascadepsidis[h_, n_] :=
  Module[{degrees, min, max, sum, hmodif, gpol, hpol, hpols, clist, tbl, z},
    (*Approximation of the wavelet function belonging
    to the filter h by using the cascade algorithm*)
    degrees = Map[First[#] &, h];
    min = Min[degrees];
    max = Max[degrees];
    sum = Last[Total[h]];
    hmodif = Map[{First[#], Last[#] / sum} &, h];
    hpol := Apply[Plus, Map[Last[#] z^First[#] &, hmodif]];
    gpol := hpol /. (z -> -1 / z);
    hpols :=
      Expand[Product[hpol /. z -> z^(2^t), {t, 0, n - 2}] (gpol /. z -> z^(2^(n - 1)))];
    clist = 2^n CoefficientList[z^(-min (2^(n - 1) - 1) + 2^(n - 1) max) hpols, z];
    tbl = Table[{(k - 1) 2^(-n), clist[[k]]}, {k, 1, Length[clist]}];
    ListPlot[tbl, PlotRange -> All, Filling -> Axis]
  ]

```

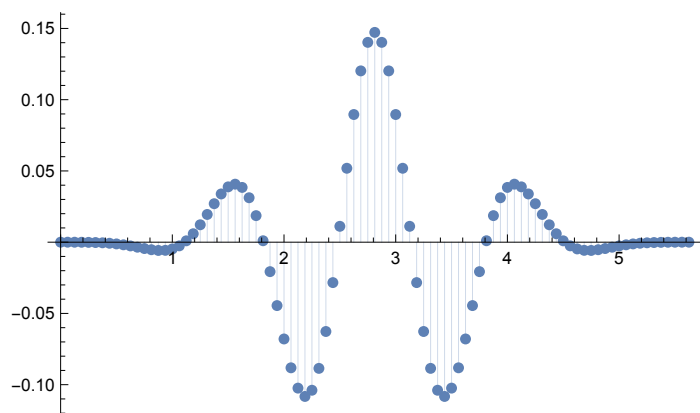
The scaling function belonging to the B spline filter for N=6

```
cascadepsidis[h[6], 6]
```



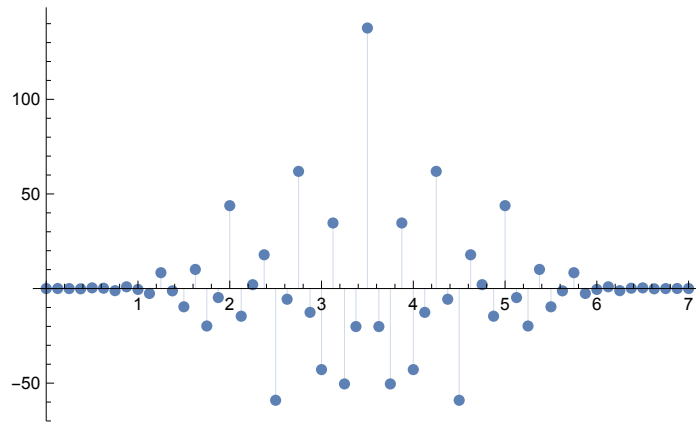
The wavelet function belonging to the B spline filter for N=6

```
cascadepsidis[h[6], 4]
```



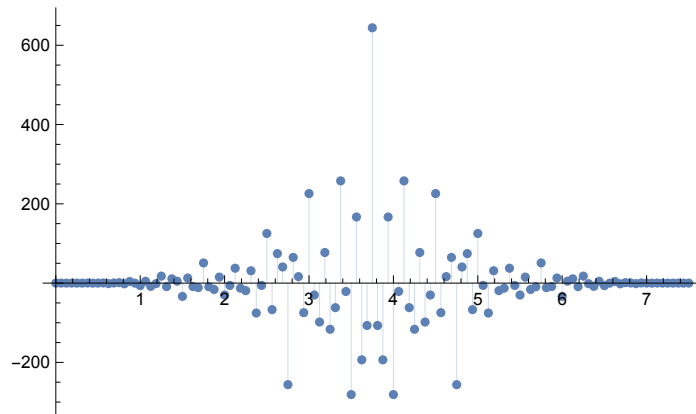
The scaling function belonging to the biorthogonal B spline filter partner for N=6 and M=2

**cascadephidis[k[2, 6], 3]**



The wavelet function belonging to the biorthogonal B-spline partner filter for N=6 and M=2

**cascadepsidis[k[2, 6], 4]**



## The CDF-7/9 filter pair

### Construction

Starting with the Daubechies polynomial

**Daub[3, z]**

$$1 + 4z + 10z^2 + 20z^3$$

Determining the complex roots of this polynomial

**roots = NSolve[Daub[3, z] == 0, z]**

{ {z → -0.342384}, {z → -0.078808 - 0.373931 i}, {z → -0.078808 + 0.373931 i} }

There is one real root and two complex conjugate roots. So the Daubechies polynomial can be factored into two polynomials with real coefficients: a linear polynomial  $p(z)$  and a quadratic polynomial  $q(z)$ . The parameter  $a$  (which is the leading coefficient of the polynomial  $p(z)$ ) will be fixed later.

**p[z\_] = a (z - (z /. roots[[1]]))**

a (0.342384 + z)

**q[z\_] = (20 / a) (z - (z /. roots[[2]])) (z - (z /. roots[[3]]))**

$$\frac{1}{a} 20 ((0.078808 - 0.373931 i) + z) ((0.078808 + 0.373931 i) + z)$$

**Expand[%]**

$$\frac{1}{a} (2.9207 - 1.11022 \times 10^{-16} i) + \frac{(3.15232 + 0. i) z}{a} + \frac{20 z^2}{a}$$

**Chop[%]**

$$\frac{2.9207}{a} + \frac{3.15232 z}{a} + \frac{20 z^2}{a}$$

The frequency representation of the H-filter that goes with the factor  $p(z)$

**H[w\_] = Sqrt[2] Cos[w / 2]^4 p[Sin[w / 2]^2]**

$$\sqrt{2} a \text{Cos}\left[\frac{w}{2}\right]^4 \left(0.342384 + \text{Sin}\left[\frac{w}{2}\right]^2\right)$$

The frequency representation of the K-filter that goes with the factor  $q(z)$

$$\mathbf{K}[\mathbf{w}_] = \mathbf{Chop}[\mathbf{Expand}[\mathbf{Sqrt}[2] \mathbf{Cos}[\mathbf{w} / 2] ^ 4 \mathbf{q}[\mathbf{Sin}[\mathbf{w} / 2] ^ 2]]]$$

$$\frac{4.13049 \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4}{\mathbf{a}} + \frac{1}{\mathbf{a}} 4.45805 \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4 \text{Sin}\left[\frac{\mathbf{w}}{2}\right]^2 + \frac{1}{\mathbf{a}} 20 \sqrt{2} \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4 \text{Sin}\left[\frac{\mathbf{w}}{2}\right]^4$$

Evaluating  $H(0)$  (which should be  $\sqrt{2}$ )

$$\mathbf{H}[\mathbf{0}]$$

$$0.484204 \mathbf{a}$$

$$\mathbf{const} = \mathbf{Solve}[\{\mathbf{H}[\mathbf{0}] == \mathbf{Sqrt}[2]\}, \{\mathbf{a}\}]$$

$$\{\{\mathbf{a} \rightarrow 2.9207\}\}$$

The Fourier series if the H-filter after fixing the constant

$$\mathbf{H}[\mathbf{w}_] = \mathbf{H}[\mathbf{w}] /. \mathbf{const}[[1]]$$

$$4.13049 \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4 \left(0.342384 + \text{Sin}\left[\frac{\mathbf{w}}{2}\right]^2\right)$$

The Fourier series of the K-filter after fixing the constant

$$\mathbf{K}[\mathbf{w}_] = \mathbf{K}[\mathbf{w}] /. \mathbf{const}[[1]]$$

$$1.41421 \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4 + 1.52637 \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4 \text{Sin}\left[\frac{\mathbf{w}}{2}\right]^2 + 9.68408 \text{Cos}\left[\frac{\mathbf{w}}{2}\right]^4 \text{Sin}\left[\frac{\mathbf{w}}{2}\right]^4$$

Checking that all is correct

$$\mathbf{K}[\mathbf{0}]$$

$$1.41421$$

## Checking orthogonality conditions for the CDF-7/9 filter pair

$$\mathbf{H}[\omega] \mathbf{Conjugate}[\mathbf{K}[\omega]] + \mathbf{H}[\omega + \mathbf{Pi}] \mathbf{Conjugate}[\mathbf{K}[\omega + \mathbf{Pi}]]$$

$$4.13049 \text{Cos}\left[\frac{\omega}{2}\right]^4 \left(\text{Conjugate}\left[1.52637 \text{Cos}\left[\frac{\omega}{2}\right]^4 \text{Sin}\left[\frac{\omega}{2}\right]^2 + 9.68408 \text{Cos}\left[\frac{\omega}{2}\right]^4 \text{Sin}\left[\frac{\omega}{2}\right]^4\right] + 1.41421 \text{Cos}\left[\frac{1}{2} \text{Conjugate}[\omega]\right]^4\right) \left(0.342384 + \text{Sin}\left[\frac{\omega}{2}\right]^2\right) + 4.13049 \text{Cos}\left[\frac{\pi + \omega}{2}\right]^4 \left(\text{Conjugate}\left[1.52637 \text{Cos}\left[\frac{\pi + \omega}{2}\right]^4 \text{Sin}\left[\frac{\pi + \omega}{2}\right]^2 + 9.68408 \text{Cos}\left[\frac{\pi + \omega}{2}\right]^4 \text{Sin}\left[\frac{\pi + \omega}{2}\right]^4\right] + 1.41421 \text{Cos}\left[\frac{1}{2} (\pi + \text{Conjugate}[\omega])\right]^4\right) \left(0.342384 + \text{Sin}\left[\frac{\pi + \omega}{2}\right]^2\right)$$

$$\mathbf{Assuming}[\omega \in \mathbf{Reals}, \mathbf{Simplify}[\%]]$$

$$4.13049 \text{Cos}\left[\frac{\omega}{2}\right]^4 \left(0.342384 + \text{Sin}\left[\frac{\omega}{2}\right]^2\right) \left(1.41421 \text{Cos}\left[\frac{\omega}{2}\right]^4 + \left(0.605255 + 0.0953979 \text{Csc}\left[\frac{\omega}{2}\right]^2\right) \text{Sin}[\omega]^4\right) + 4.13049 \left(0.342384 + \text{Cos}\left[\frac{\omega}{2}\right]^2\right) \text{Sin}\left[\frac{\omega}{2}\right]^4 \left(1.41421 \text{Sin}\left[\frac{\omega}{2}\right]^4 + \left(0.605255 + 0.0953979 \text{Sec}\left[\frac{\omega}{2}\right]^2\right) \text{Sin}[\omega]^4\right)$$

**FullSimplify[Expand[%]**

$$2. + 3.33067 \times 10^{-16} \cos[2 \omega] + 2.77556 \times 10^{-17} \cos[3 \omega] - 2.08167 \times 10^{-17} \cos[4 \omega] - 3.46945 \times 10^{-18} \cos[5 \omega]$$

**Chop[%]**

2.

## Properties of the CDF-7/9 filter pair

**TrigToExp[H[ $\omega$ ]]**

$$0.788486 + 0.418092 e^{-i \omega} + 0.418092 e^{i \omega} - 0.0406894 e^{-2 i \omega} - 0.0406894 e^{2 i \omega} - 0.0645389 e^{-3 i \omega} - 0.0645389 e^{3 i \omega}$$

**hcoeffs = CoefficientList[Expand[Exp[3 I  $\omega$ ] %], E^{I  $\omega$ }]**

{-0.0645389, -0.0406894, 0.418092, 0.788486, 0.418092, -0.0406894, -0.0645389}

The filter coefficients of the H-filter of length 7

**hfilter = Table[{k - 4, hcoeffs[[k]]}, {k, 1, 7}]**

{{-3, -0.0645389}, {-2, -0.0406894}, {-1, 0.418092},  
{0, 0.788486}, {1, 0.418092}, {2, -0.0406894}, {3, -0.0645389}}

**TrigToExp[K[ $\omega$ ]]**

$$0.852699 + 0.377403 e^{-i \omega} + 0.377403 e^{i \omega} - 0.110624 e^{-2 i \omega} - 0.110624 e^{2 i \omega} - 0.0238495 e^{-3 i \omega} - 0.0238495 e^{3 i \omega} + 0.0378285 e^{-4 i \omega} + 0.0378285 e^{4 i \omega}$$

**kcoeffs = Re[CoefficientList[Expand[Exp[4 I  $\omega$ ] %], E^{I  $\omega$ }]**

{0.0378285, -0.0238495, -0.110624, 0.377403,  
0.852699, 0.377403, -0.110624, -0.0238495, 0.0378285}

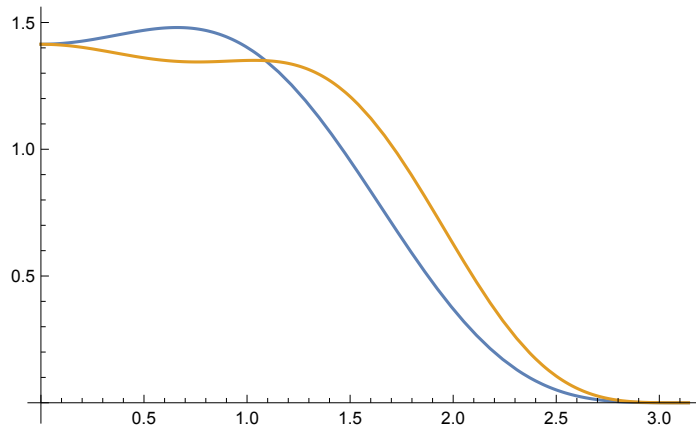


The filter coefficients of the K-filter of length 7

```
kfilter = Table[{k - 5, kcoeffs[[k]]}, {k, 1, 9}]
```

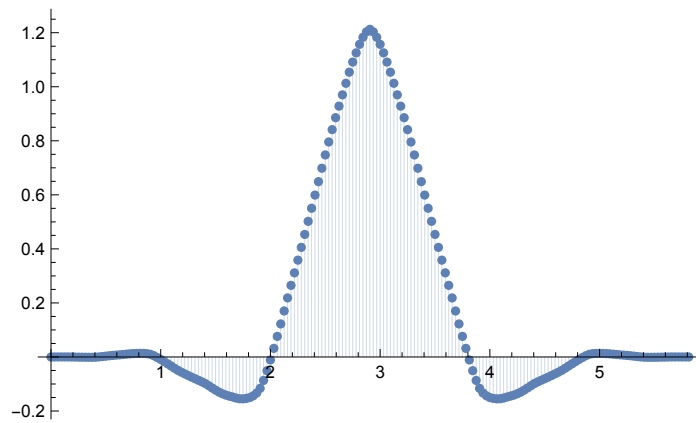
```
{{-4, 0.0378285}, {-3, -0.0238495}, {-2, -0.110624}, {-1, 0.377403},  
{0, 0.852699}, {1, 0.377403}, {2, -0.110624}, {3, -0.0238495}, {4, 0.0378285}}
```

```
Plot[{H[ $\omega$ ], K[ $\omega$ ]}, { $\omega$ , 0, Pi}]
```



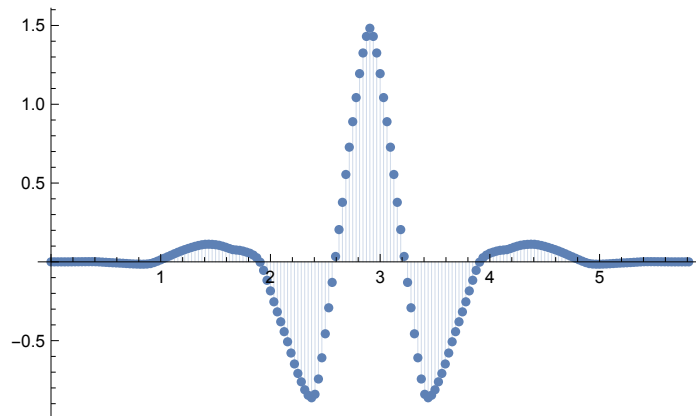
The scaling function belonging to the H-filter of length 7

```
cascaidephidis[hfilter, 5]
```



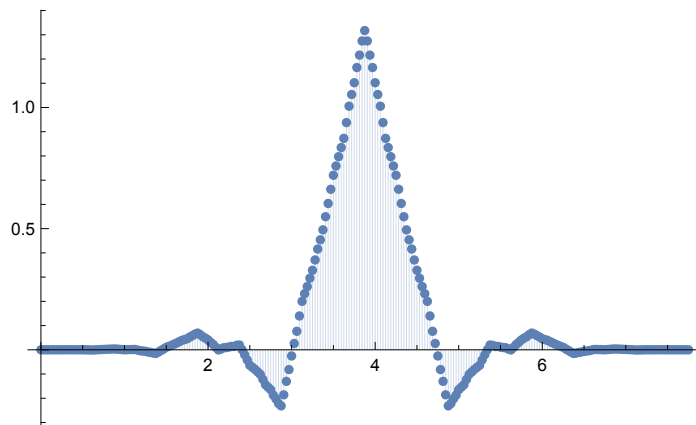
The wavelet function belonging to the H-filter of length 7

`cascadepsidis[hfilter, 5]`



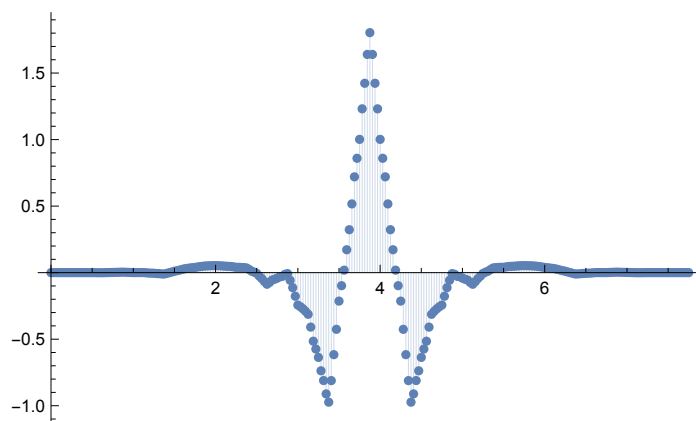
The scaling function belonging to the K-filter of length 9

`cascadephidis[kfilter, 5]`



The wavelet function belonging to the K-filter of length 9

`cascadepsidis[kfilter, 5]`



Low-pass conditions for the H-filter

**{H' [ω], H' [ω] / . ω → Pi}**

$$\left\{ 4.13049 \cos\left[\frac{\omega}{2}\right]^5 \sin\left[\frac{\omega}{2}\right] - 8.26098 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right] \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right), 0. \right\}$$

**{H'' [ω], H'' [ω] / . ω → Pi}**

$$\left\{ 2.06524 \cos\left[\frac{\omega}{2}\right]^6 - 18.5872 \cos\left[\frac{\omega}{2}\right]^4 \sin\left[\frac{\omega}{2}\right]^2 - 4.13049 \cos\left[\frac{\omega}{2}\right]^4 \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right) + 12.3915 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^2 \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right), 0. \right\}$$

**{H''' [ω], H''' [ω] / . ω → Pi}**

$$\left\{ -28.9134 \cos\left[\frac{\omega}{2}\right]^5 \sin\left[\frac{\omega}{2}\right] + 49.5659 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right]^3 + 20.6524 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right] \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right) - 12.3915 \cos\left[\frac{\omega}{2}\right] \sin\left[\frac{\omega}{2}\right]^3 \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right), 0. \right\}$$

**{H'''' [ω], H'''' [ω] / . ω → Pi}**

$$\left\{ -14.4567 \cos\left[\frac{\omega}{2}\right]^6 + 167.285 \cos\left[\frac{\omega}{2}\right]^4 \sin\left[\frac{\omega}{2}\right]^2 - 86.7403 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^4 + 10.3262 \cos\left[\frac{\omega}{2}\right]^4 \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right) - 49.5659 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^2 \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right) + 6.19573 \sin\left[\frac{\omega}{2}\right]^4 \left(0.342384 + \sin\left[\frac{\omega}{2}\right]^2\right), 8.31705 \right\}$$

Low-pass conditions for the K-filter

$\{\mathbf{K}'[\omega], \mathbf{K}'[\omega] / . \omega \rightarrow \mathbf{Pi}\}$

$$\left\{ -2.82843 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right] + 1.52637 \cos\left[\frac{\omega}{2}\right]^5 \sin\left[\frac{\omega}{2}\right] - 3.05273 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right]^3 + \right. \\ \left. 19.3682 \cos\left[\frac{\omega}{2}\right]^5 \sin\left[\frac{\omega}{2}\right]^3 - 19.3682 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right]^5, 0. \right\}$$

$\{\mathbf{K}''[\omega], \mathbf{K}''[\omega] / . \omega \rightarrow \mathbf{Pi}\}$

$$\left\{ -1.41421 \cos\left[\frac{\omega}{2}\right]^4 + 0.763183 \cos\left[\frac{\omega}{2}\right]^6 + 4.24264 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^2 - \right. \\ \left. 8.39501 \cos\left[\frac{\omega}{2}\right]^4 \sin\left[\frac{\omega}{2}\right]^2 + 29.0523 \cos\left[\frac{\omega}{2}\right]^6 \sin\left[\frac{\omega}{2}\right]^2 + 4.5791 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^4 - \right. \\ \left. 96.8408 \cos\left[\frac{\omega}{2}\right]^4 \sin\left[\frac{\omega}{2}\right]^4 + 29.0523 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^6, 0. \right\}$$

$\{\mathbf{K}'''[\omega], \mathbf{K}'''[\omega] / . \omega \rightarrow \mathbf{Pi}\}$

$$\left\{ 7.07107 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right] - 10.6846 \cos\left[\frac{\omega}{2}\right]^5 \sin\left[\frac{\omega}{2}\right] + 29.0523 \cos\left[\frac{\omega}{2}\right]^7 \sin\left[\frac{\omega}{2}\right] - \right. \\ \left. 4.24264 \cos\left[\frac{\omega}{2}\right] \sin\left[\frac{\omega}{2}\right]^3 + 25.9482 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right]^3 - 280.838 \cos\left[\frac{\omega}{2}\right]^5 \sin\left[\frac{\omega}{2}\right]^3 - \right. \\ \left. 4.5791 \cos\left[\frac{\omega}{2}\right] \sin\left[\frac{\omega}{2}\right]^5 + 280.838 \cos\left[\frac{\omega}{2}\right]^3 \sin\left[\frac{\omega}{2}\right]^5 - 29.0523 \cos\left[\frac{\omega}{2}\right] \sin\left[\frac{\omega}{2}\right]^7, 0. \right\}$$

$\{\mathbf{K}''''[\omega], \mathbf{K}''''[\omega] / . \omega \rightarrow \mathbf{Pi}\}$

$$\left\{ 3.53553 \cos\left[\frac{\omega}{2}\right]^4 - 5.34228 \cos\left[\frac{\omega}{2}\right]^6 + 14.5261 \cos\left[\frac{\omega}{2}\right]^8 - \right. \\ \left. 16.9706 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^2 + 65.6337 \cos\left[\frac{\omega}{2}\right]^4 \sin\left[\frac{\omega}{2}\right]^2 - 522.941 \cos\left[\frac{\omega}{2}\right]^6 \sin\left[\frac{\omega}{2}\right]^2 + \right. \\ \left. 2.12132 \sin\left[\frac{\omega}{2}\right]^4 - 50.3701 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^4 + 1404.19 \cos\left[\frac{\omega}{2}\right]^4 \sin\left[\frac{\omega}{2}\right]^4 + \right. \\ \left. 2.28955 \sin\left[\frac{\omega}{2}\right]^6 - 522.941 \cos\left[\frac{\omega}{2}\right]^2 \sin\left[\frac{\omega}{2}\right]^6 + 14.5261 \sin\left[\frac{\omega}{2}\right]^8, 18.937 \right\}$$