

4. Vorlesung Mikroskopische Bildverarbeitung

Wahlpflichtmodul 9521: EI-M im 1. und 3. Fachsemester

Initialisierung

4. Dezember 2015

Wiederholung aus der 3. Vorlesung

Aus 10. Histogramme, Histogrammausgleich, Histogrammanpassung

Histogrammausgleich

- Ziel ist eine linear ansteigende kumulative Häufigkeitsverteilung (Annahme, daß im Normalfall jede Intensitätsstufe gleichhäufig vorzukommen habe)
- aus der kumulativen Häufigkeitsverteilung wird durch Normierung auf die Bildgröße und den Wertebereich eine Tonwertkurve als Look-up-Table erstellt

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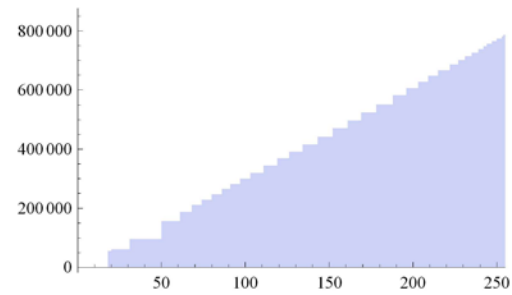
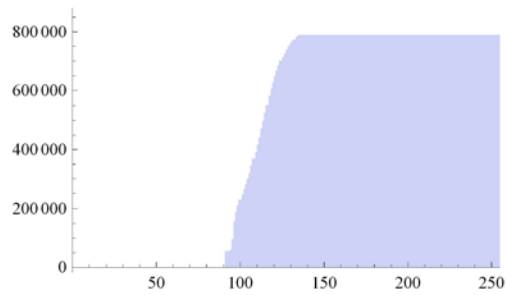
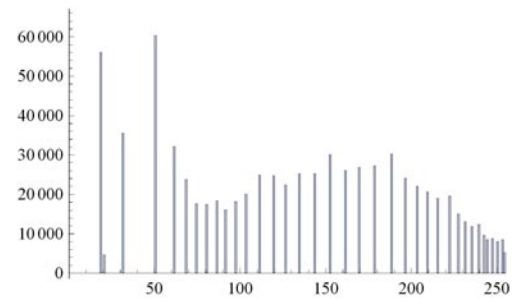
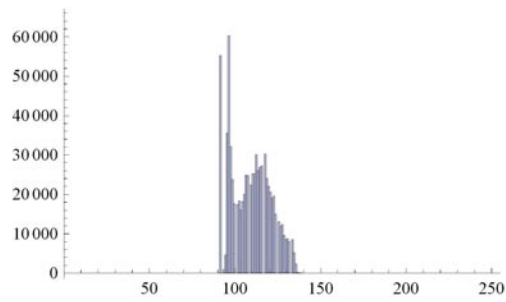
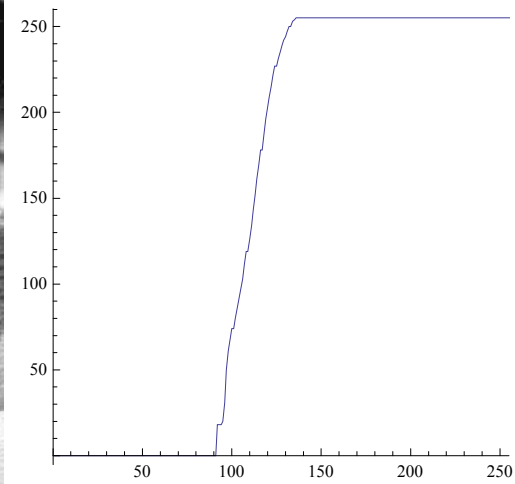
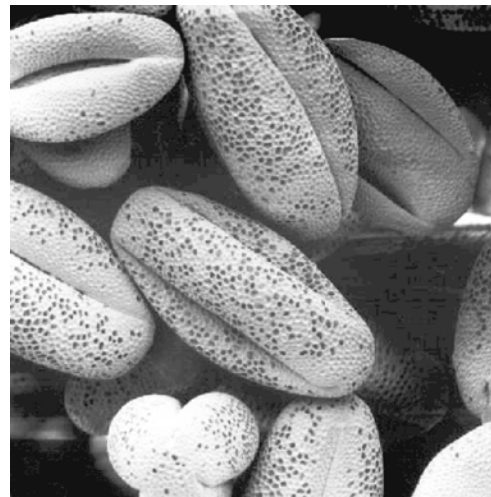
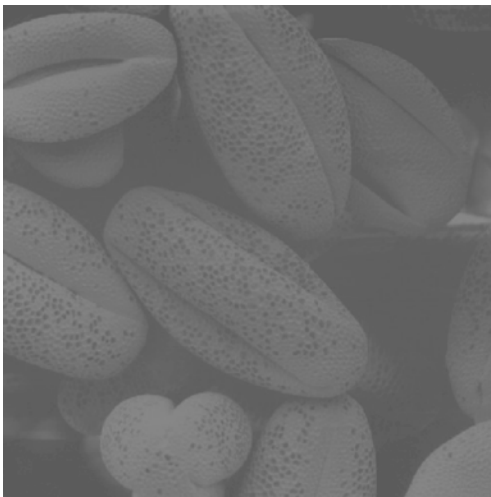
Clear[histogrammausgleich]
histogrammausgleich[skalarbildein_Image] := Module[{stufenanzahlen, kumulation, skalarbildaus},
  stufenanzahlen = BinCounts[Flatten[ImageData[skalarbildein, "Byte"]], {0, 255 + 1, 1}];
  kumulation = Round[Accumulate[stufenanzahlen] / (Times @@ ImageDimensions[skalarbildein]) * 255];
  (*
  Print[Grid[{{Show[ListPlot[stufenanzahlen, Filling→Axis, PlotRange→{{0, 255}, All}], ImageSize→256],
    Show[ListLinePlot[kumulation, AspectRatio→1, PlotRange→{{0, 255}, All}], ImageSize→256}}]}}];
  *)
  skalarbildaus = Image[Map[kumulation[#[+1]] &, ImageData[skalarbildein, "Byte"], {2}], "Byte"];
  Print[Grid[{{Show[skalarbildein, ImageSize→256], Show[skalarbildaus, ImageSize→256],
    Show[ListLinePlot[kumulation, AspectRatio→1, PlotRange→{{0, 255}, All}], ImageSize→256}}]}}];

  Print[Grid[{{Show[Histogram[Flatten[ImageData[skalarbildein, "Byte"]], {0, 255, 1}, "Count", PlotRange→{{0, 255}, Automatic},
    AxesOrigin→{0, 0}], ImageSize→256], Show[Histogram[Flatten[ImageData[skalarbildaus, "Byte"]],
    {0, 255, 1}, "Count", PlotRange→{{0, 255}, Automatic}, AxesOrigin→{0, 0}], ImageSize→256}}]}}];

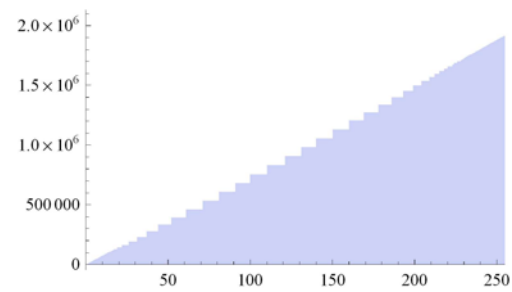
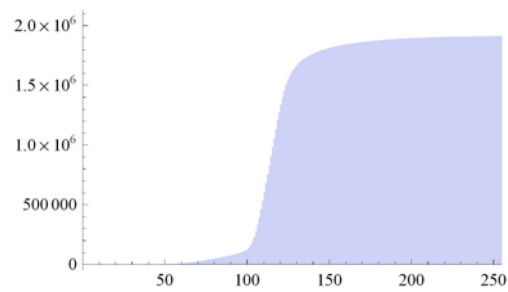
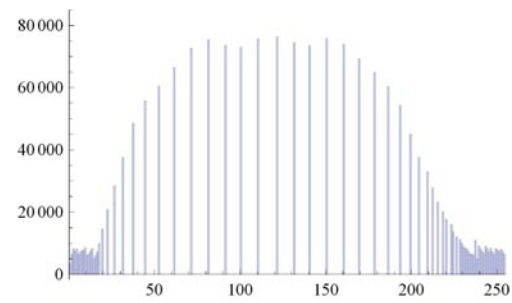
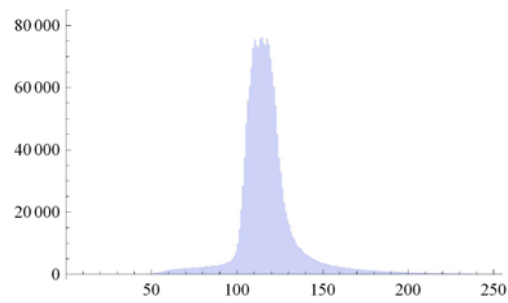
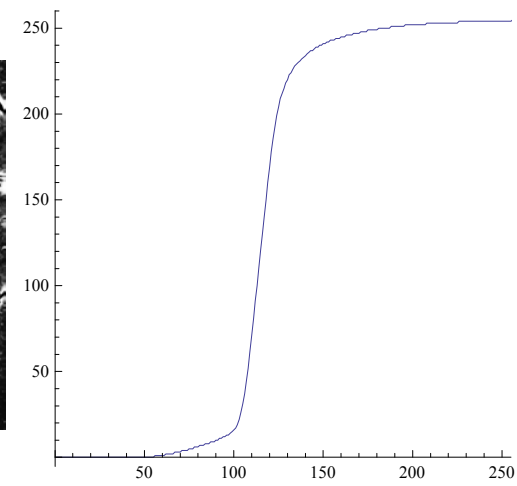
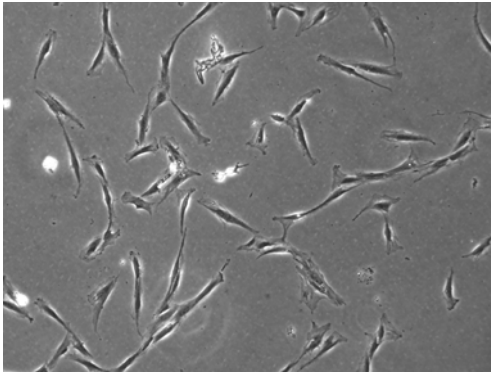
  Print[Grid[{{Show[Histogram[Flatten[ImageData[skalarbildein, "Byte"]], {0, 255, 1}, "CumulativeCount", PlotRange→{{0, 255}, Automatic},
    AxesOrigin→{0, 0}], ImageSize→256], Show[Histogram[Flatten[ImageData[skalarbildaus, "Byte"]],
    {0, 255, 1}, "CumulativeCount", PlotRange→{{0, 255}, Automatic}], ImageSize→256}}]}}];
  (*
  Print[MapThread[{#1->#2}&,{Range[0,255],kumulation}]];
  *)
  skalarbildaus
];

histogrammausgleich[pollen];

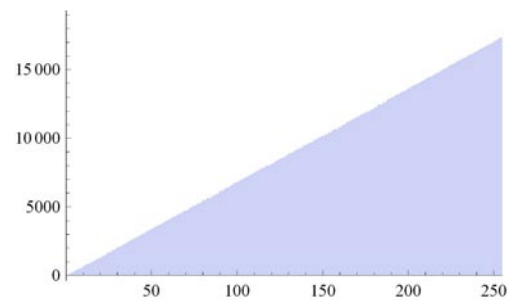
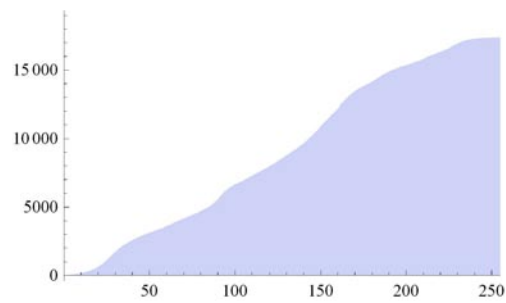
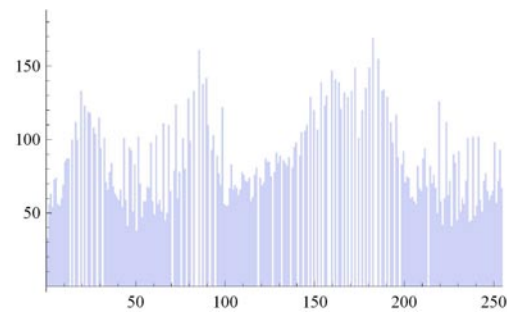
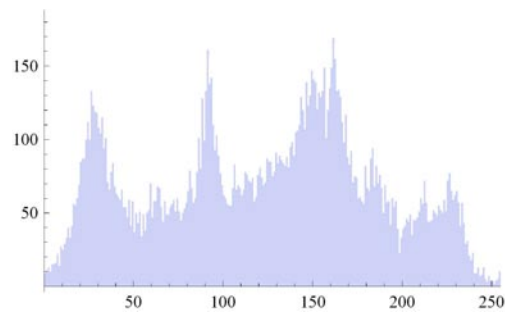
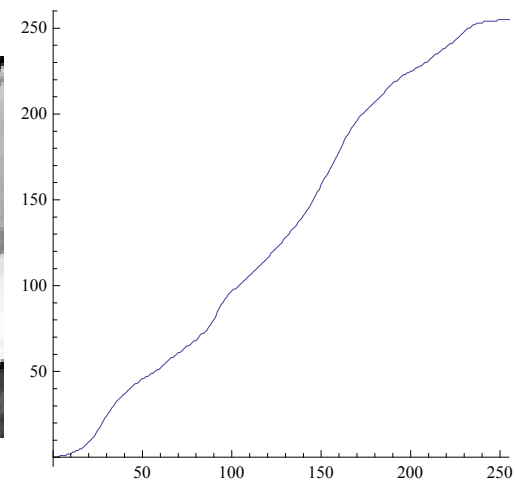
```



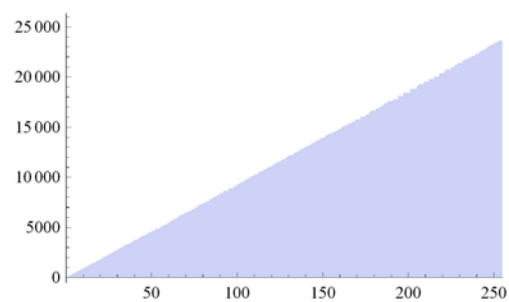
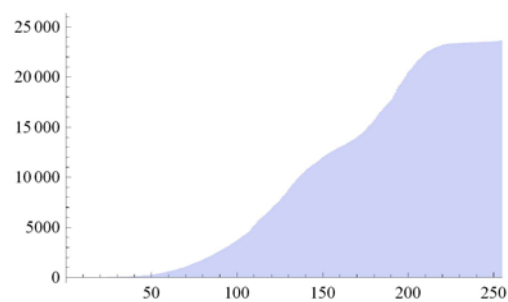
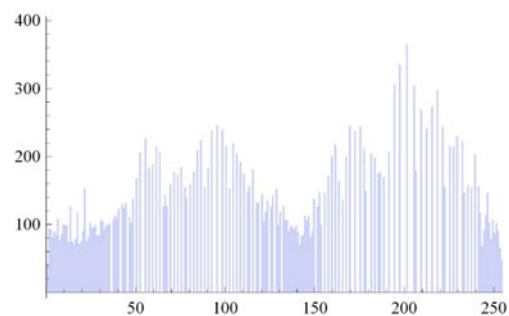
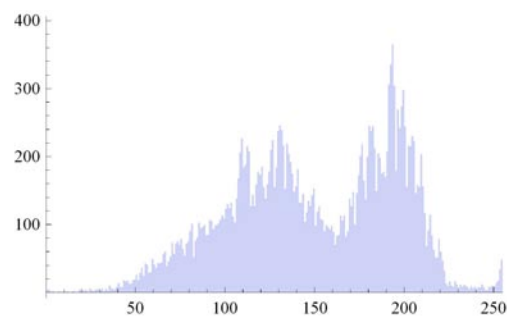
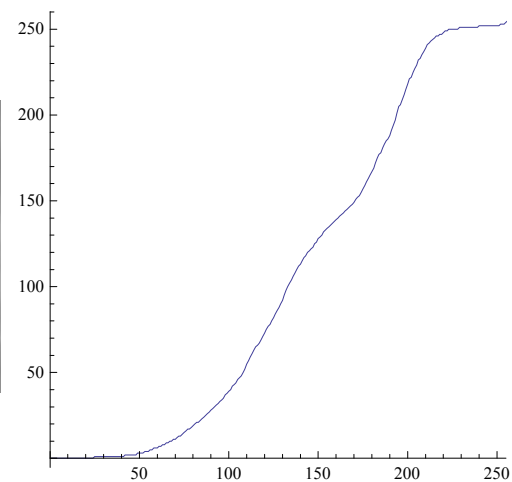
```
histogrammausgleich[phasenkontrast];
```

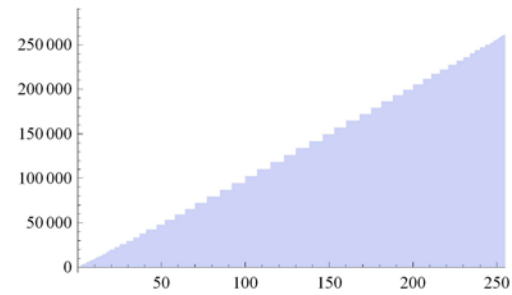
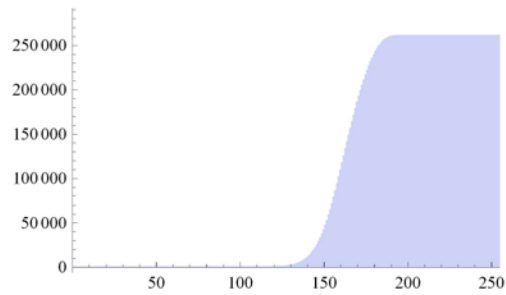
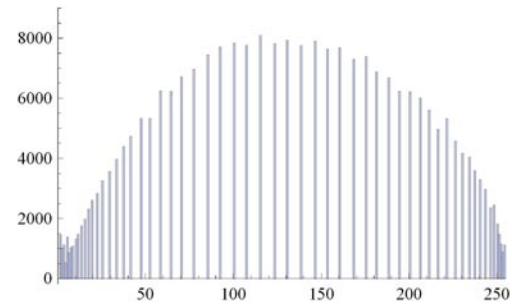
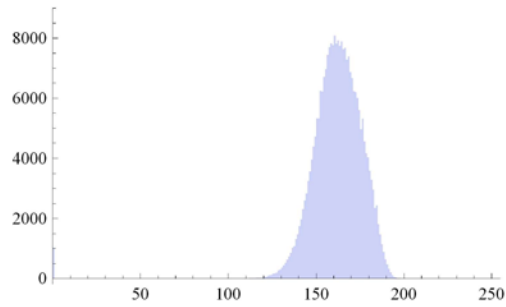
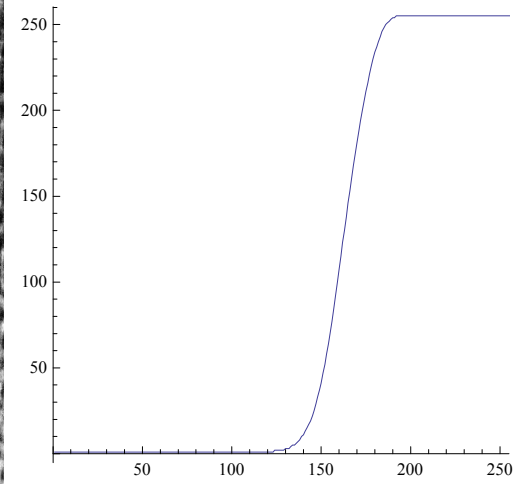
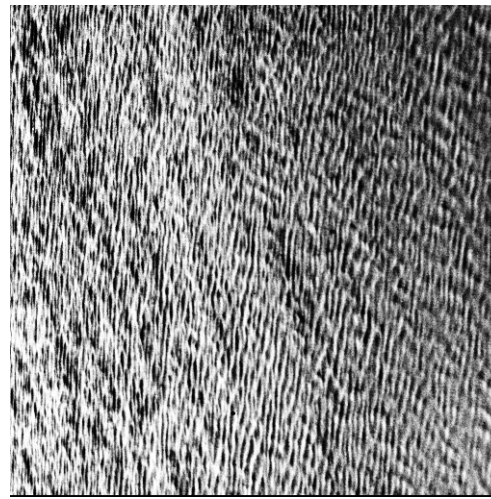
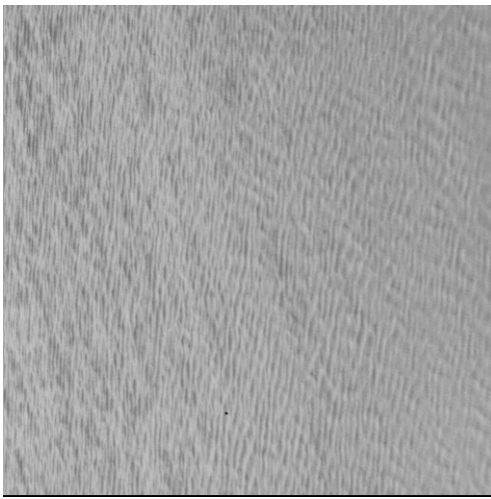
```
histogrammausgleich[1enay];
```



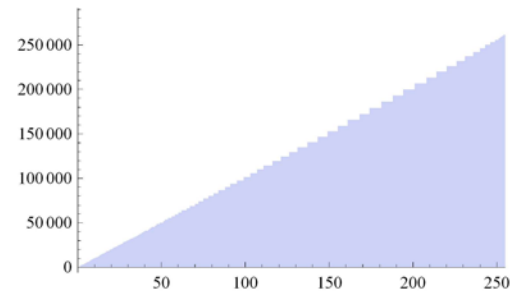
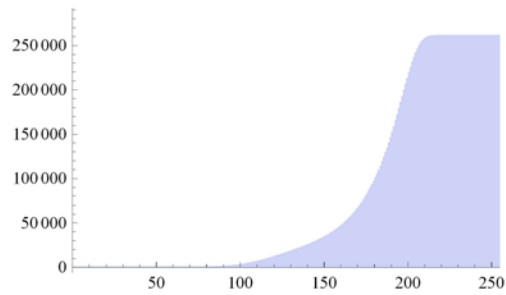
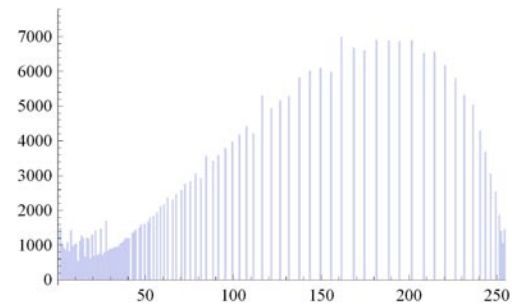
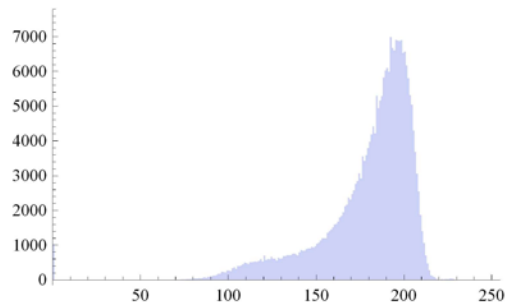
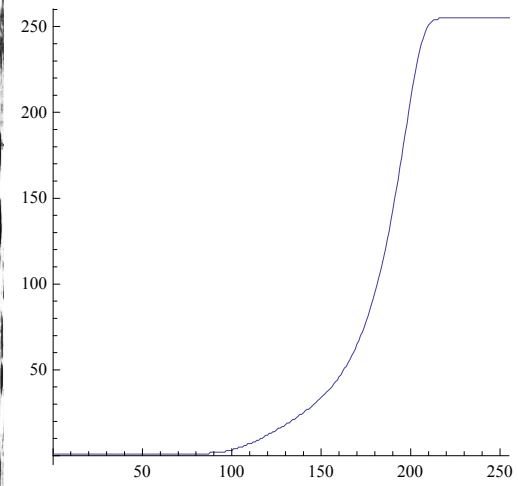
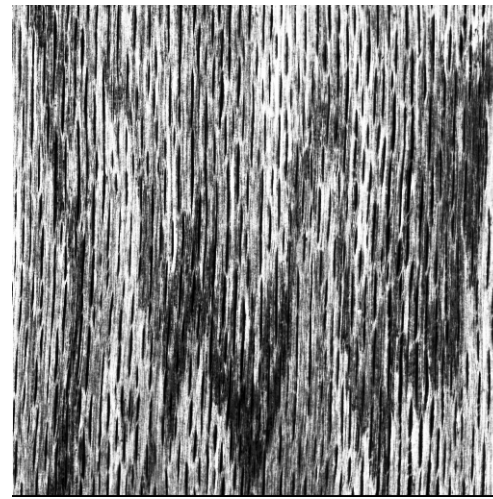
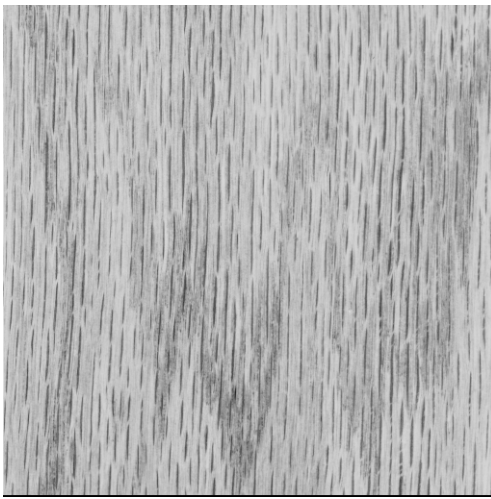
```
histogramausgleich[turtle];
```



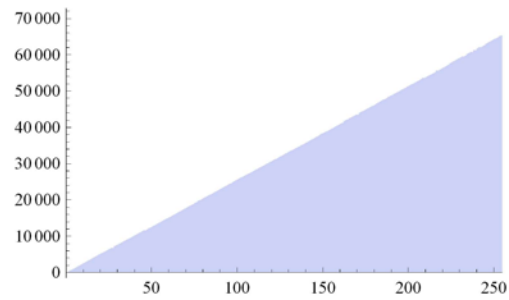
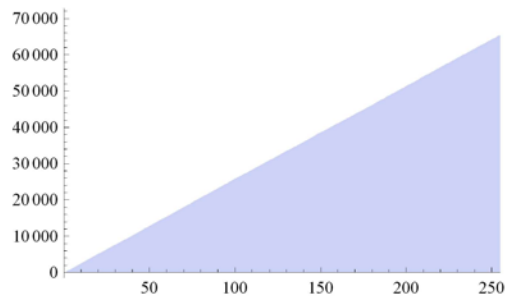
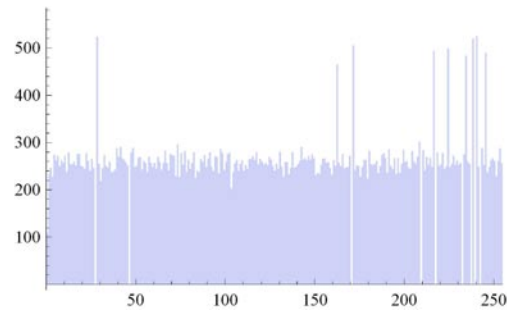
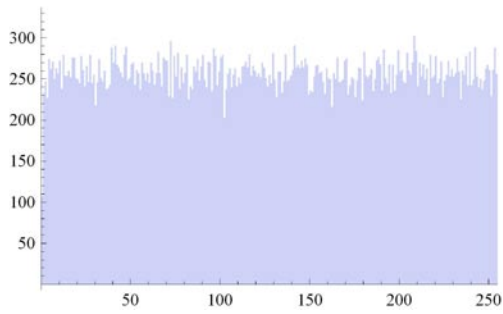
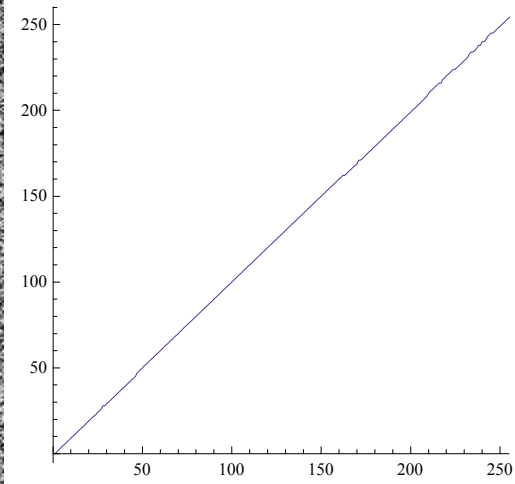
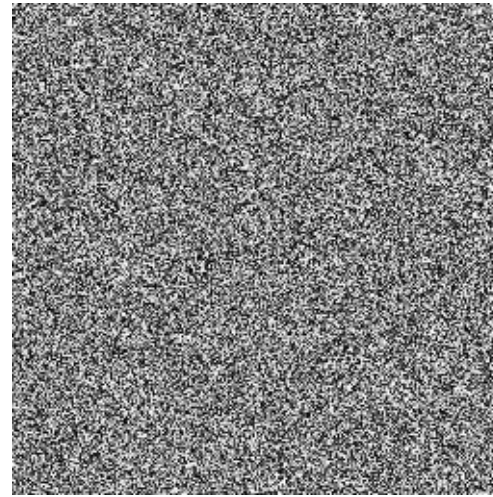
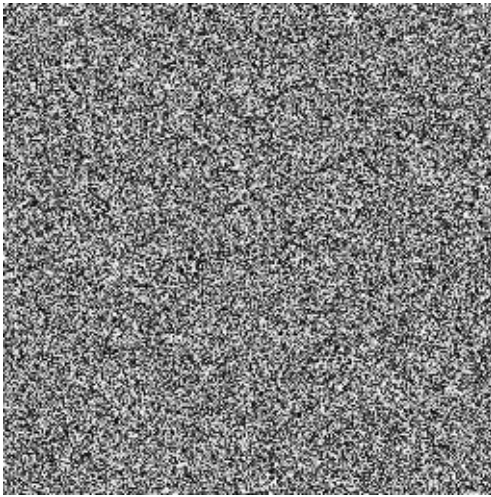
```
histogrammausgleich[maserung1];
```



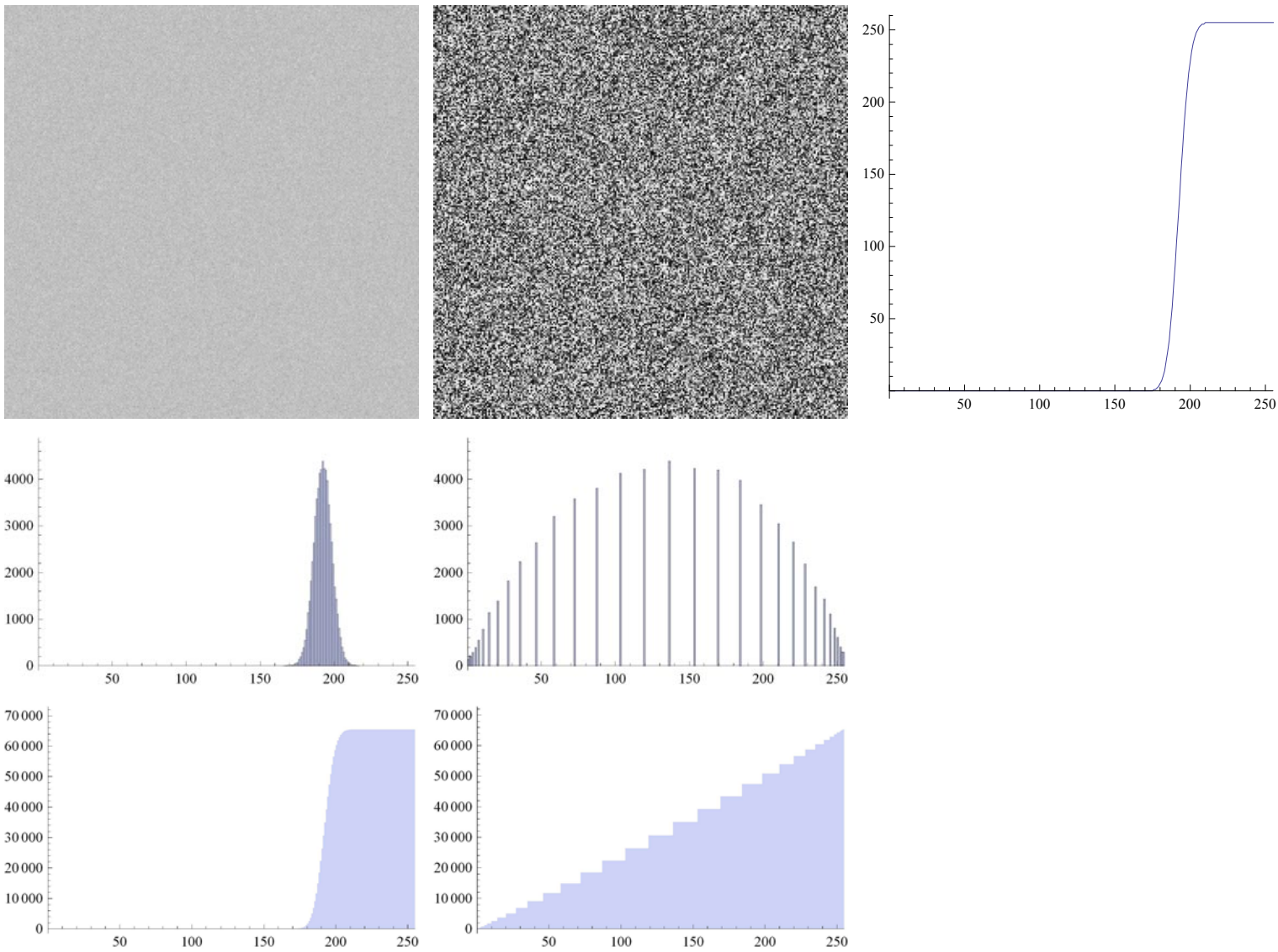
```
histogrammausgleich[maserung2];
```



```
histogrammausgleich[randombild];
```

```
histogramausgleich[rauschbild];
```



Histogrammanpassung

- Ziel ist die möglichst genaue Anpassung der Verteilungsfunktion $p_{\text{in}}(i)$ eines Bildes G_{in} an die Verteilungsfunktion $p_{\text{ref}}(i)$

eines Referenzbildes G_{ref} für alle i des Wertebereichs $[0 \dots G_{\text{max}}]$

- man liest für jedes Pixel den Wert der kumulativen Wahrscheinlichkeitsdichte des Bildes ab und schaut mit diesem Ablesewert in der kumulativen Wahrscheinlichkeitsdichte des Referenzbildes nach, welcher Referenzbildwert dazu korrespondiert

- es wird eine Tonwertkurve als Look-up-Table erstellt

```
Clear[histogrammanpassung]
histogrammanpassung[skalarbildein_Image, skalarbildref_Image] :=
Module[{stufenanzahlenein, stufenanzahlenref, kumulationein, kumulationref, skalarbilddaus, lut},
  stufenanzahlenein = BinCounts[Flatten[ImageData[skalarbildein, "Byte"]], {0, 255 + 1, 1}];
  kumulationein = Accumulate[stufenanzahlenein];
  kumulationein = N[kumulationein / Last[kumulationein]];
  stufenanzahlenref = BinCounts[Flatten[ImageData[skalarbildref, "Byte"]], {0, 255 + 1, 1}];
  kumulationref = Accumulate[stufenanzahlenref];
  kumulationref = N[kumulationref / Last[kumulationref]];

  Print[Grid[{{Show[skalarbildein, ImageSize → 256],
    Show[ListLinePlot[kumulationein, AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256}}]}}];
  Print[Grid[{{Show[skalarbildref, ImageSize → 256], Show[ListLinePlot[kumulationref,
    AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256}}]}}];

  (*
  Print[Grid[{{Show[ListPlot[stufenanzahlenein, Filling → Axis, PlotRange → {{0, 255}, All}], ImageSize → 256],
    Show[ListLinePlot[kumulationein, AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256], Show[skalarbildein, ImageSize → 256]}]}}];
  Print[Grid[{{Show[ListPlot[stufenanzahlenref, Filling → Axis, PlotRange → {{0, 255}, All}], ImageSize → 256],
    Show[ListLinePlot[kumulationref, AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256], Show[skalarbildref, ImageSize → 256]}]}}];
  *)
  lut = Map[Function[mapwert, -1 + First@First@Position[kumulationref, _? (# ≥ kumulationein[[mapwert + 1]] &)]], Range[0, 255, 1], {1}];

  skalarbilddaus = Image[Map[lut[[#]] &, ImageData[skalarbildein, "Byte"] + 1, {2}], "Byte"];
  (*Print[Grid[{{Show[skalarbildein, ImageSize → 256], Show[skalarbilddaus, ImageSize → 256]}]}}];*)

  (*
  Print[Grid[{{Show[ListLinePlot[kumulationein, AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256],
    Show[ListLinePlot[kumulationref, AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256],
    Show[ListLinePlot[lut, AspectRatio → 1, PlotRange → {{0, 255}, All}], ImageSize → 256]}]}}];
  *)
```



```

Print[Grid[{{Show[skalarbildein, ImageSize → 256], Show[skalarbildaus, ImageSize → 256],
  Show[ListLinePlot[lut, AspectRatio → 1, PlotRange → {{0, 255}, {0, 255}}], ImageSize → 256}}]}}];
(*
Print@Show[Histogram[{Flatten[ImageData[skalarbildein, "Byte"]], Flatten[ImageData[skalarbildref, "Byte"]],
  Flatten[ImageData[skalarbildaus, "Byte"]]}, {0, 255, 1}, PlotRange → {{0, 255}, Automatic}, AxesOrigin → {0, 0}], ImageSize → 256];
*)

Print[Grid[{{Show[skalarbildein, ImageSize → 256], Show[skalarbildref, ImageSize → 256], Show[skalarbildaus, ImageSize → 256}}]}}];

Print[Grid[{{Show[Histogram[Flatten[ImageData[skalarbildein, "Byte"]], {0, 255, 1}, "Count", PlotRange → {{0, 255}, Automatic},
  AxesOrigin → {0, 0}], ImageSize → 256], Show[Histogram[Flatten[ImageData[skalarbildref, "Byte"]], {0, 255, 1}, "Count",
  PlotRange → {{0, 255}, Automatic}, AxesOrigin → {0, 0}], ImageSize → 256], Show[Histogram[Flatten[ImageData[skalarbildaus, "Byte"]],
  {0, 255, 1}, "Count", PlotRange → {{0, 255}, Automatic}, AxesOrigin → {0, 0}], ImageSize → 256}}]}}];

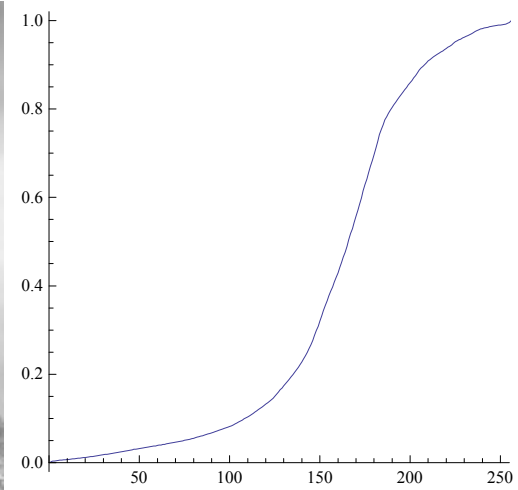
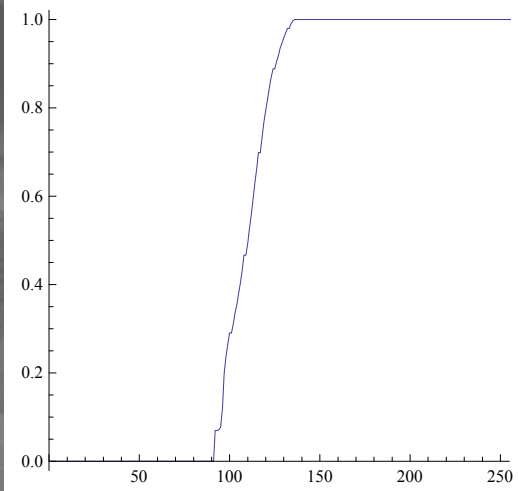
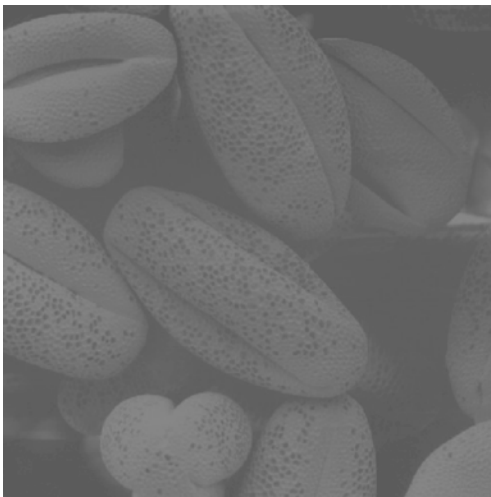
Print[Grid[{{Show[Histogram[Flatten[ImageData[skalarbildein, "Byte"]], {0, 255, 1}, "CumulativeCount", PlotRange → {{0, 255}, Automatic},
  AxesOrigin → {0, 0}], ImageSize → 256], Show[Histogram[Flatten[ImageData[skalarbildref, "Byte"]], {0, 255, 1}, "CumulativeCount",
  PlotRange → {{0, 255}, Automatic}, AxesOrigin → {0, 0}], ImageSize → 256], Show[Histogram[Flatten[ImageData[skalarbildaus, "Byte"]],
  {0, 255, 1}, "CumulativeCount", PlotRange → {{0, 255}, Automatic}], ImageSize → 256}}]}}];

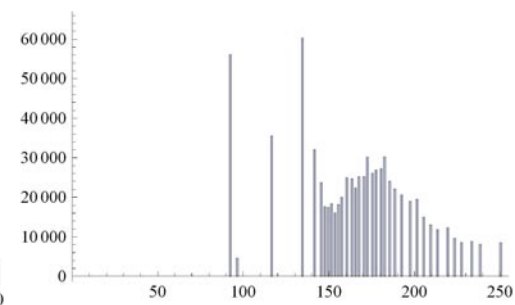
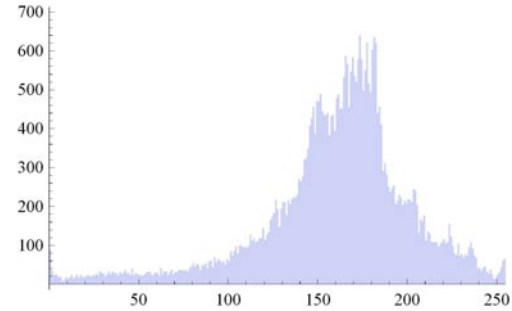
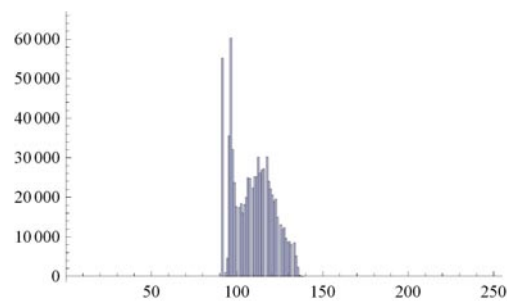
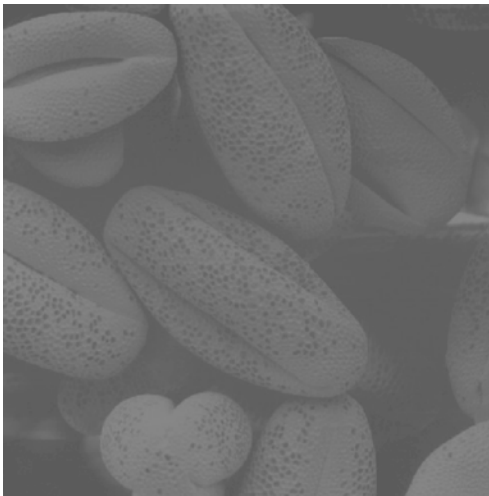
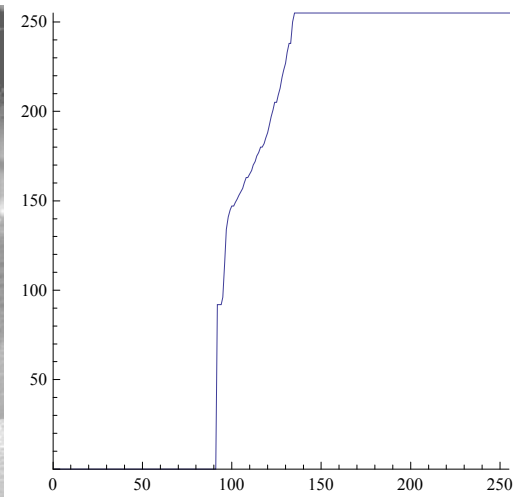
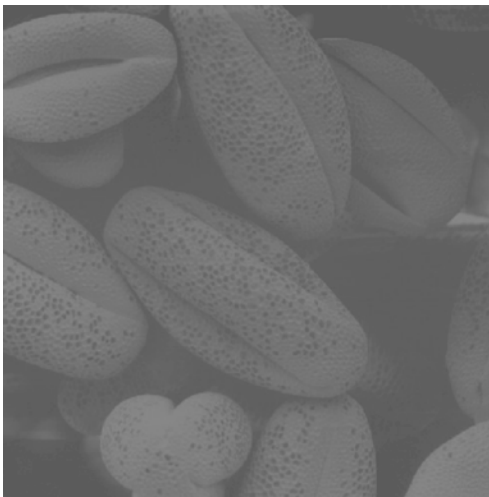
(*
Print[MapThread[ (#1->#2) &, {Range[0, 255], lut}]]];
*)
skalarbildaus

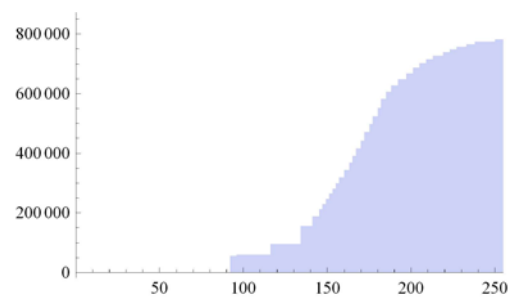
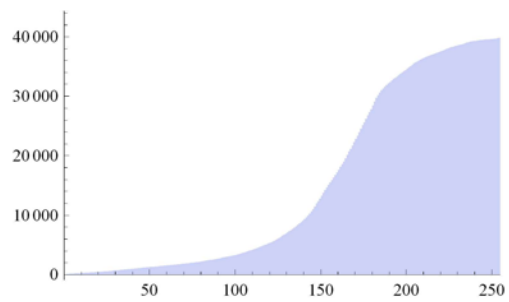
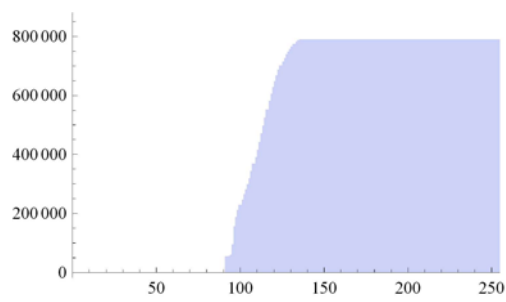
];

histogrammanpassung[pollen, ocelot];

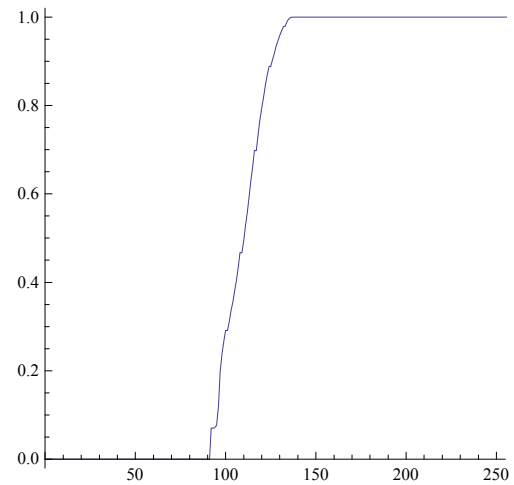
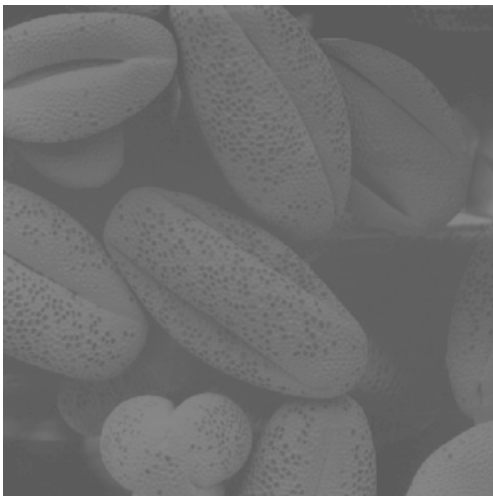
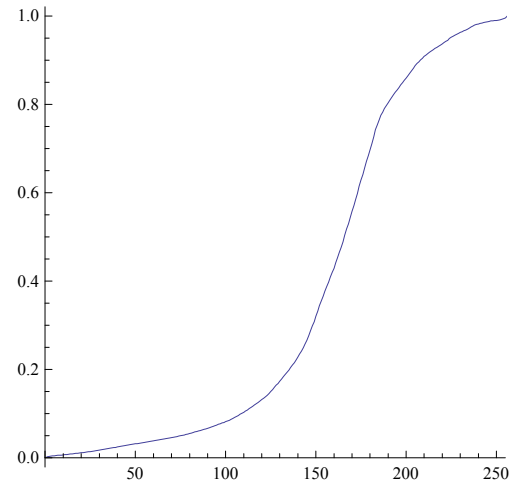
```

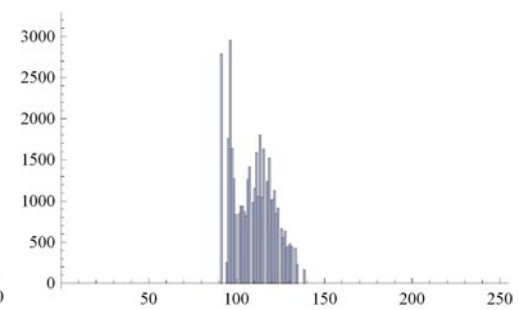
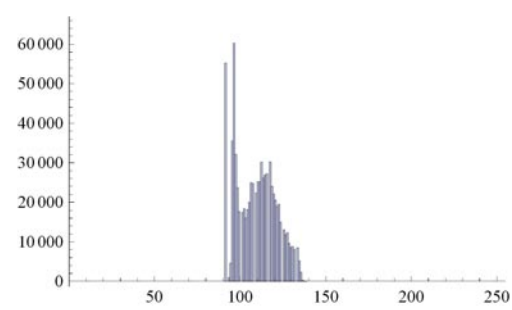
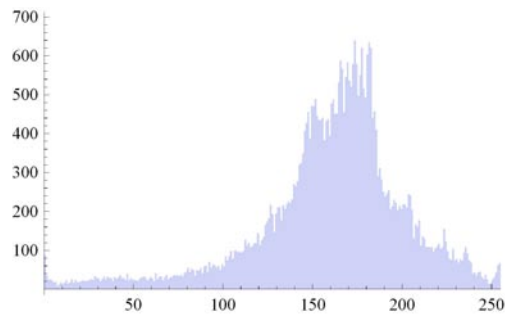
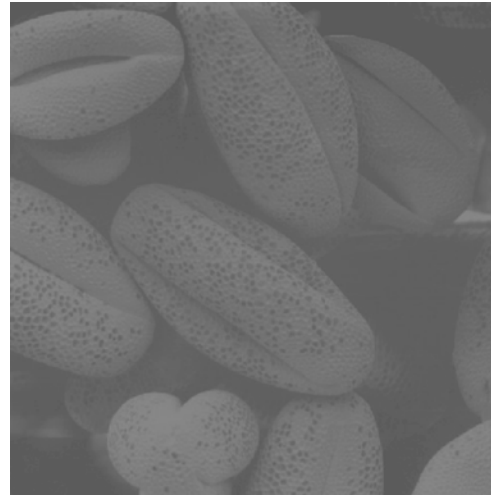
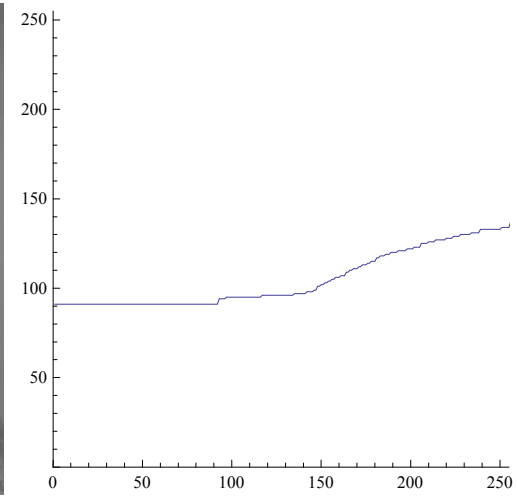


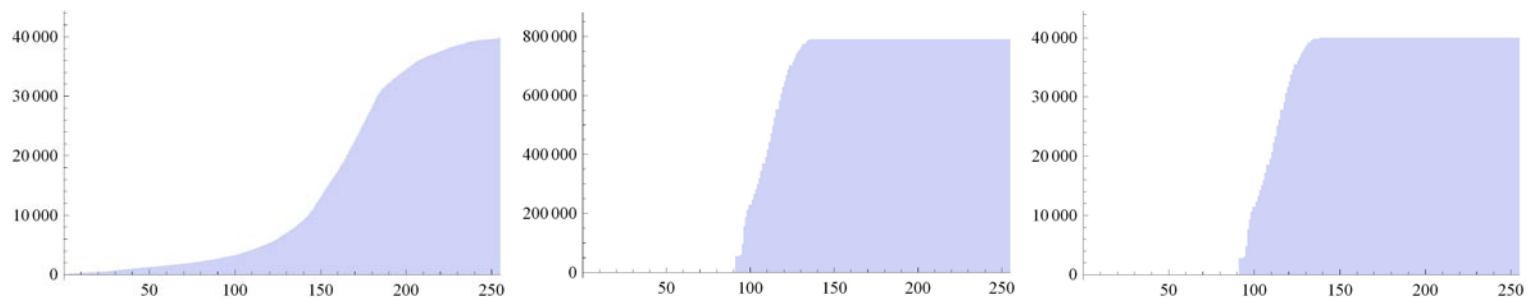




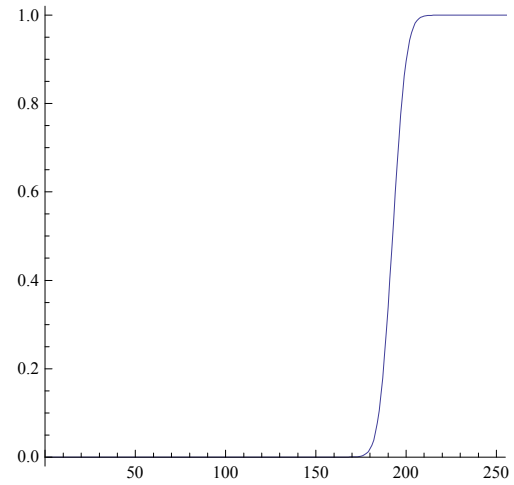
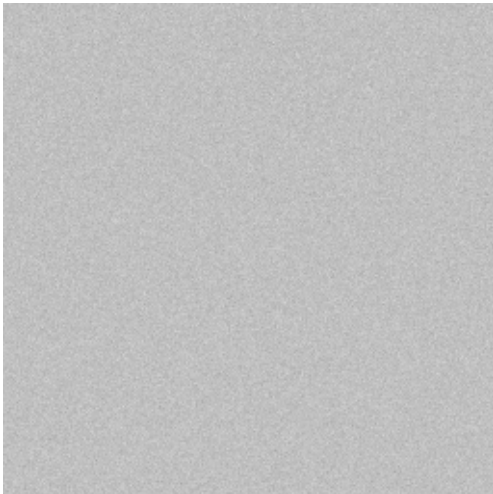
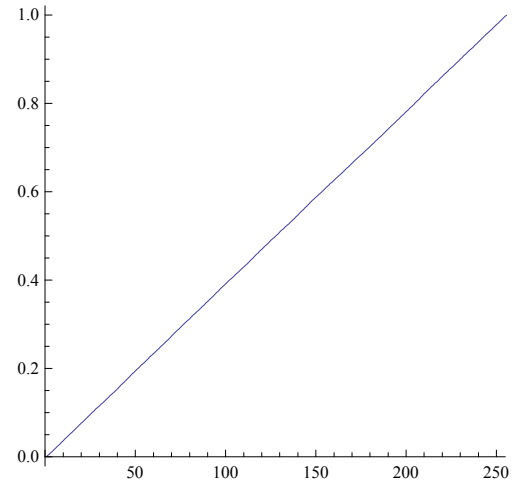
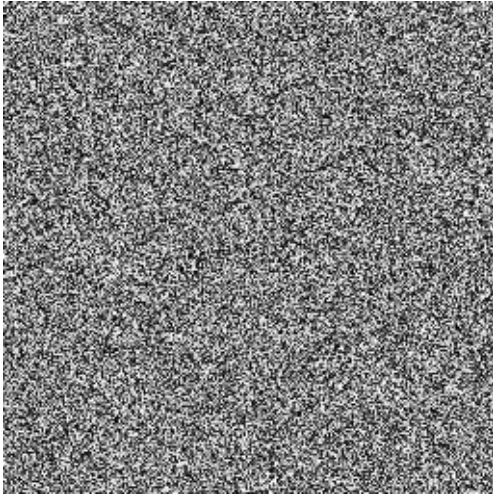
```
histogrammanpassung[ocelot, pollen];
```

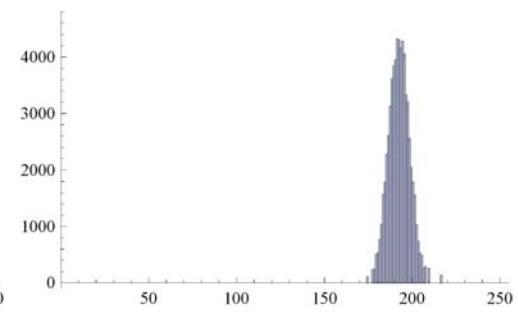
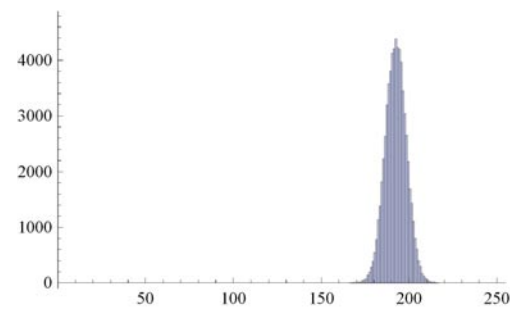
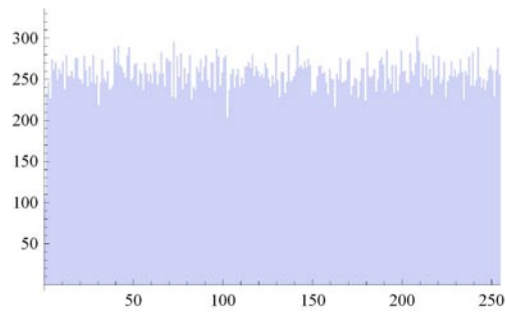
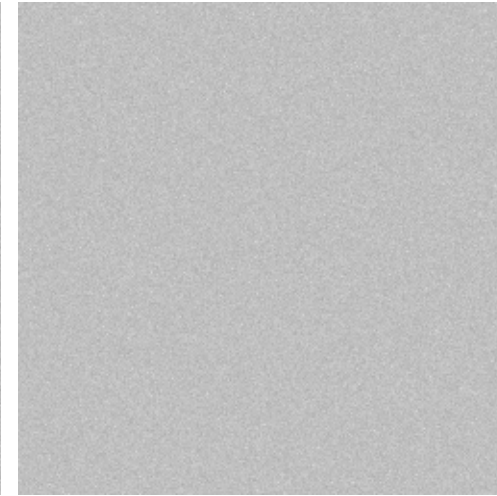
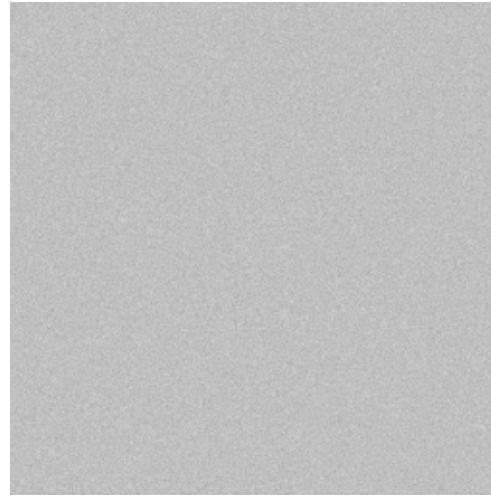
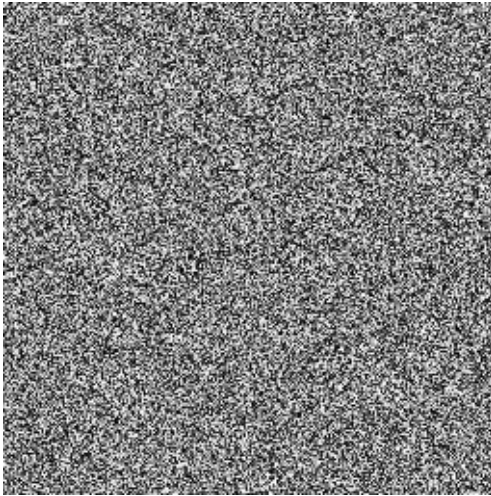
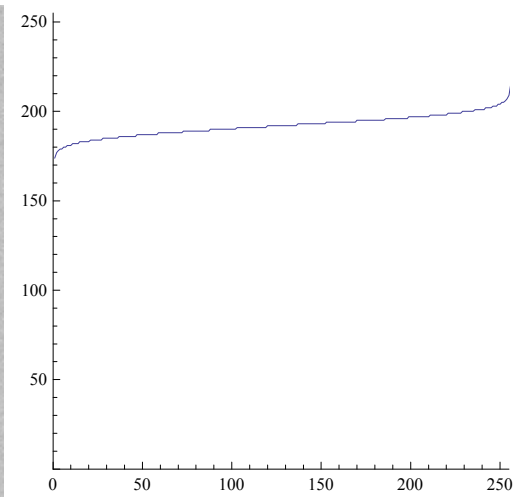
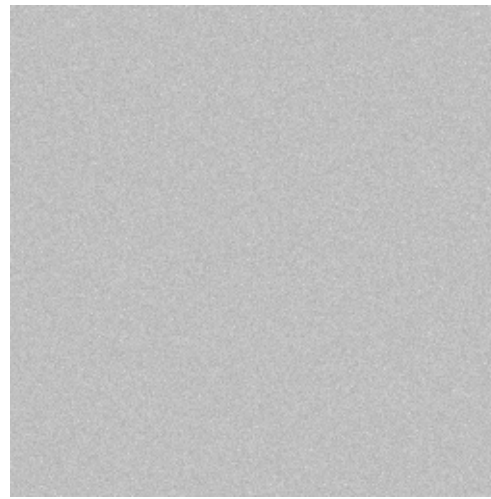
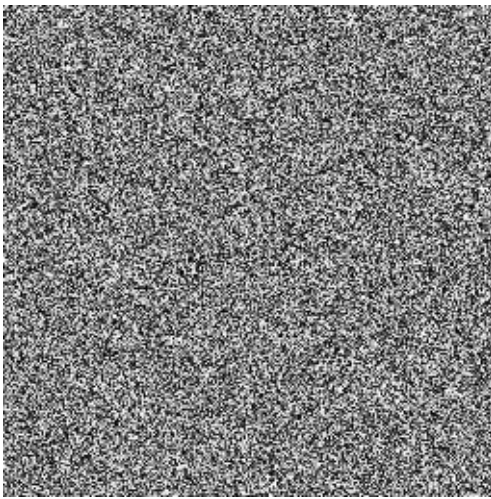


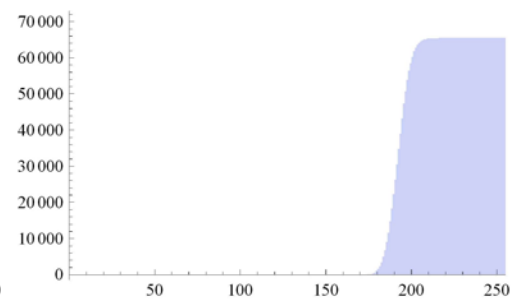
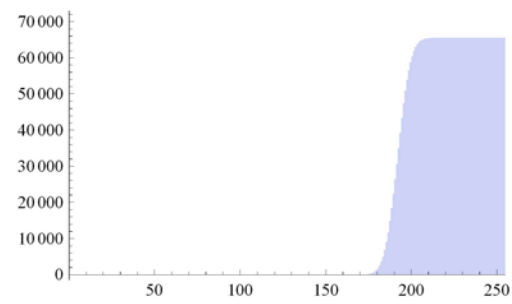
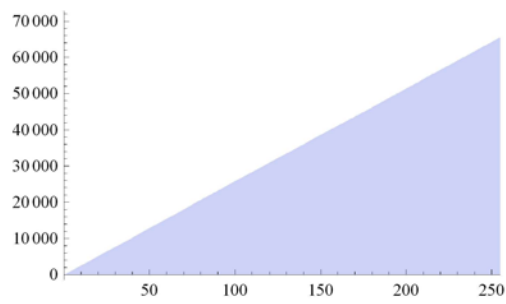




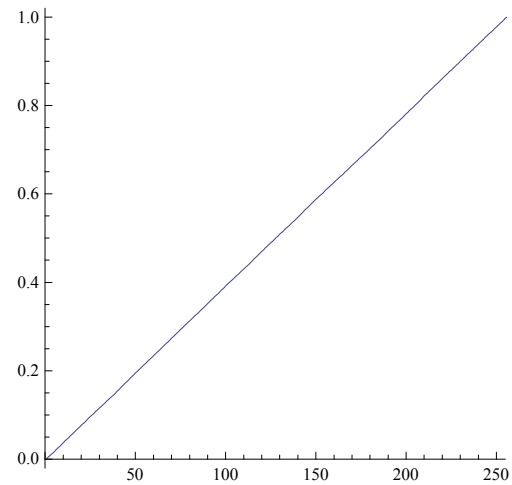
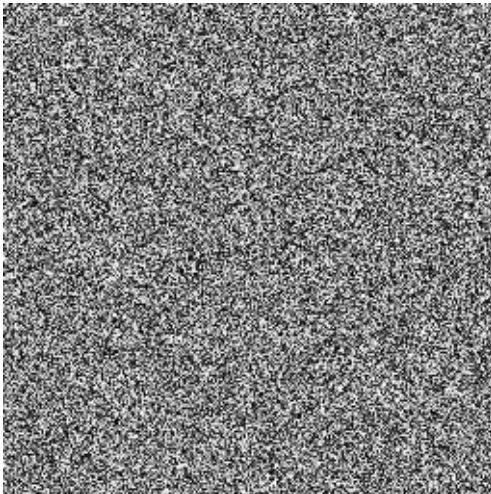
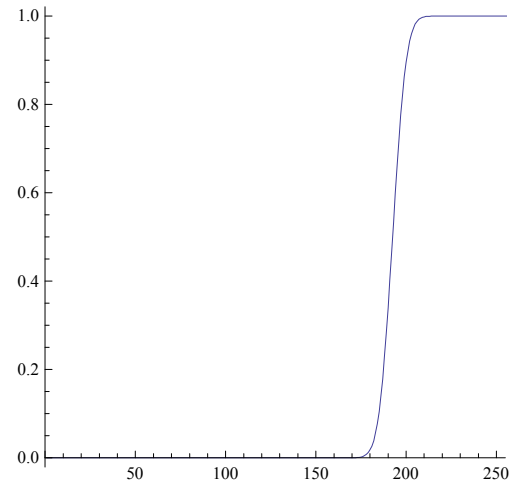
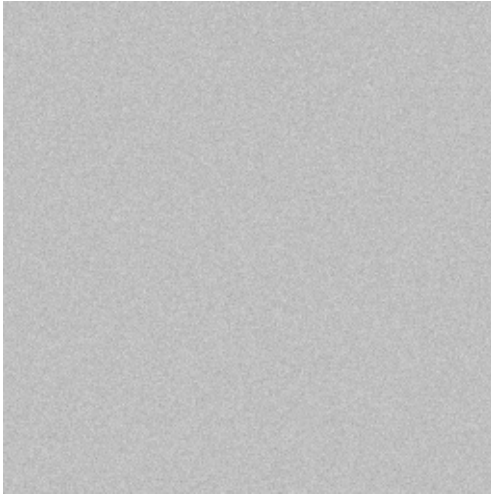
```
histogrammanpassung[randombild, rauschbild];
```

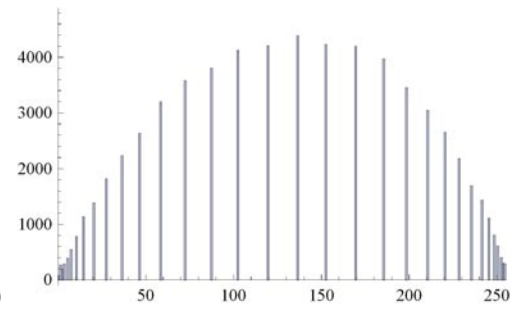
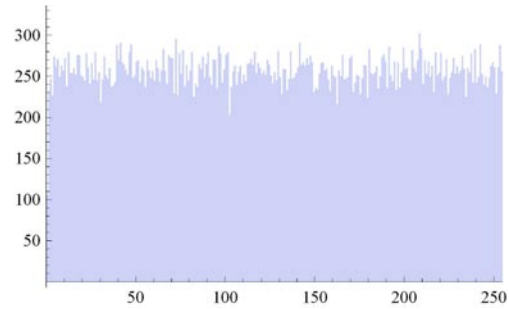
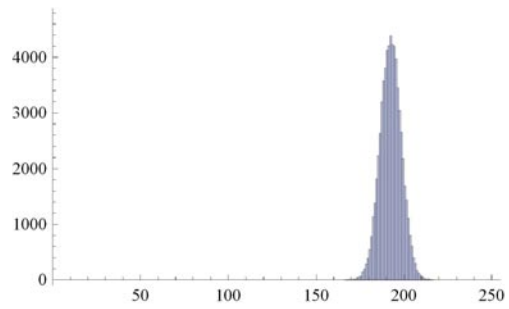
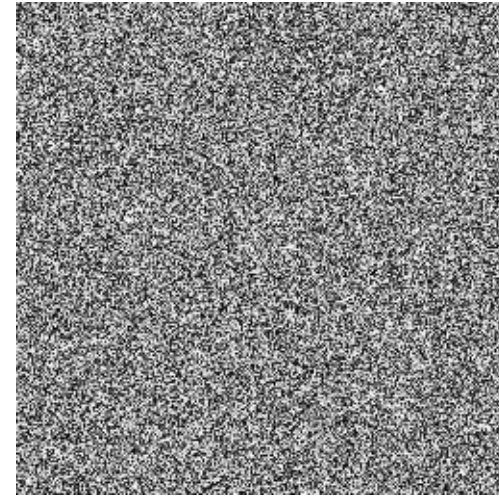
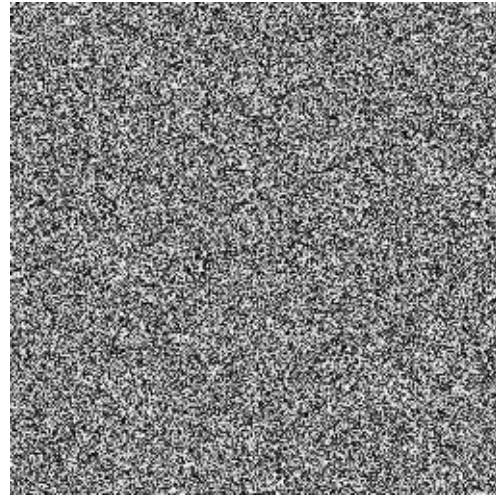
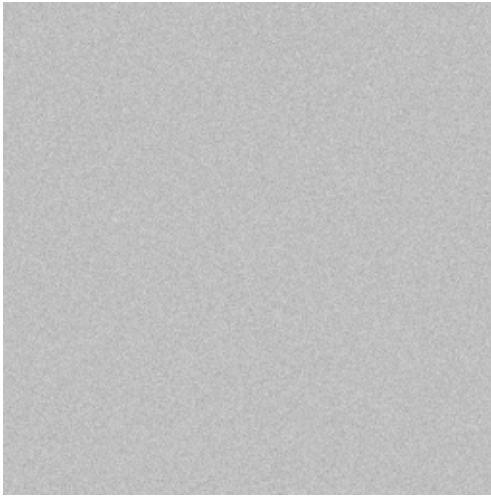
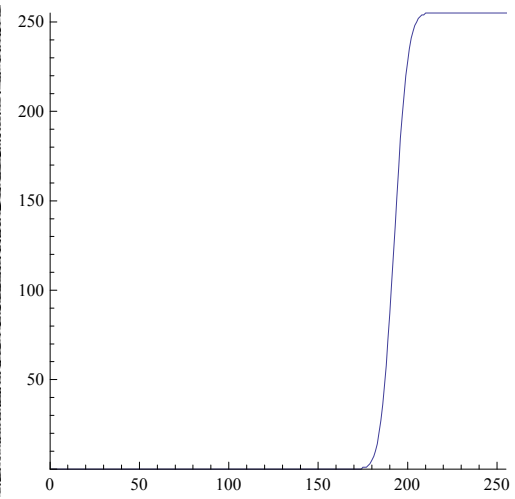
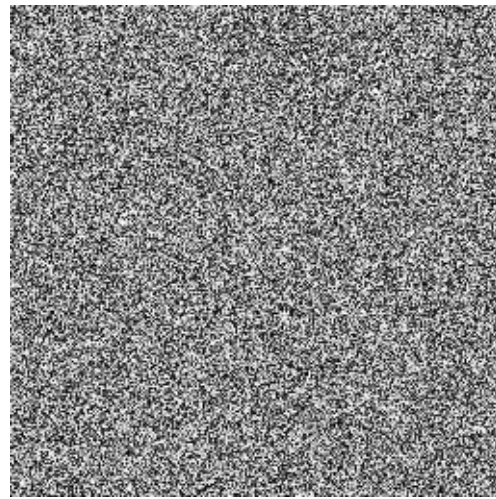
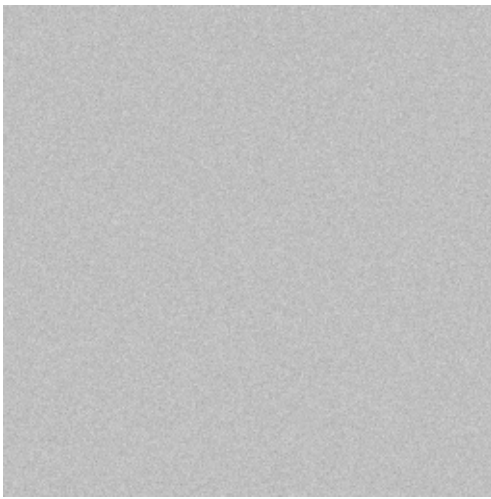


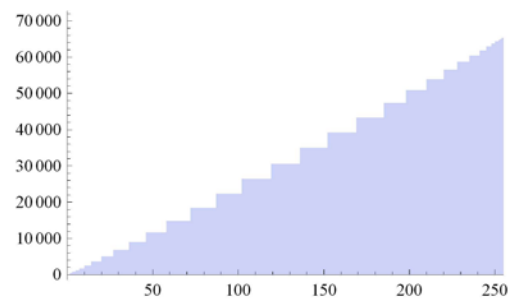
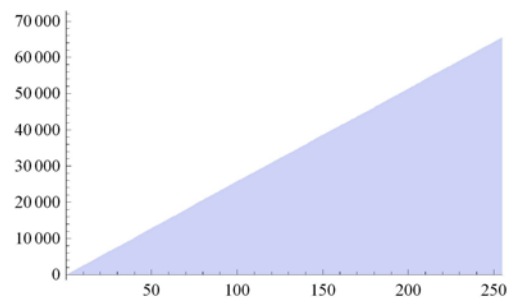
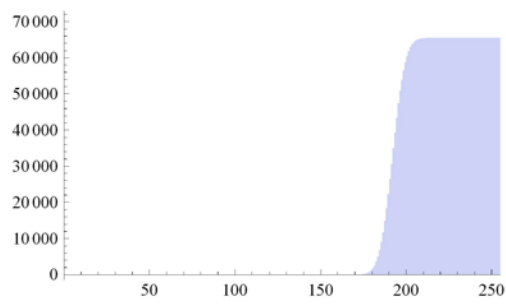




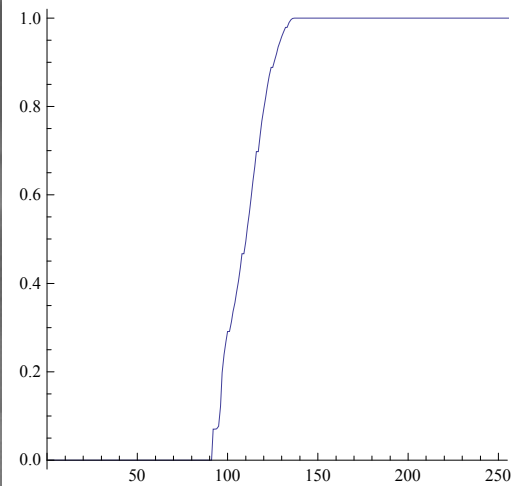
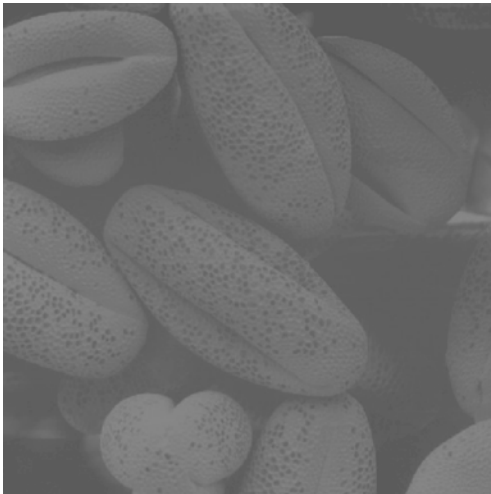
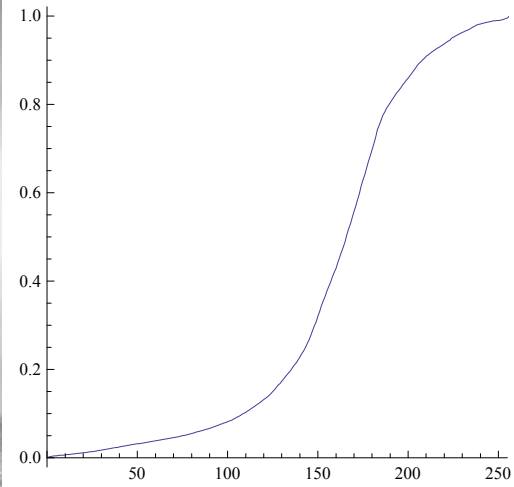
```
histogrammanpassung[rauschbild, randombild];
```

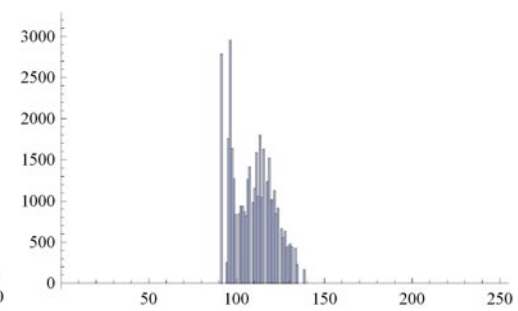
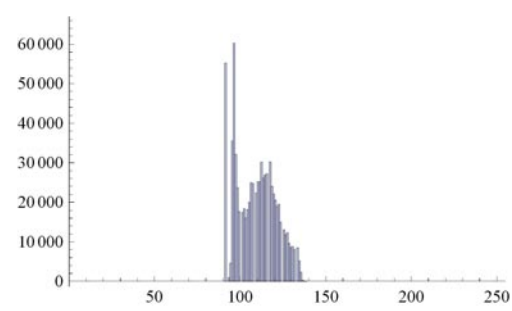
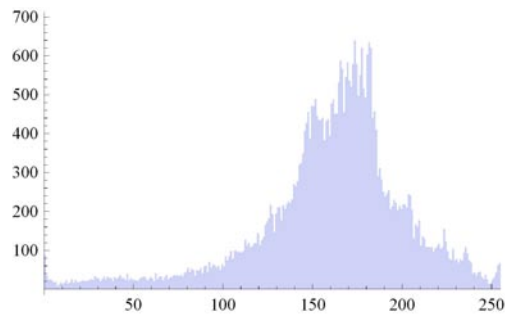
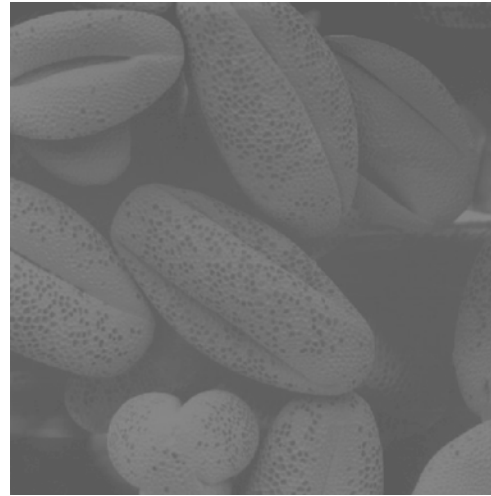
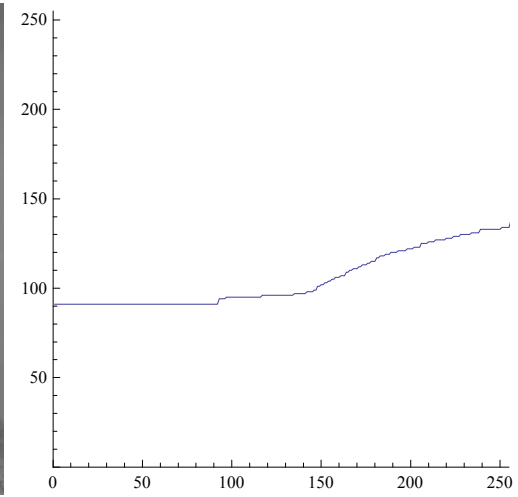


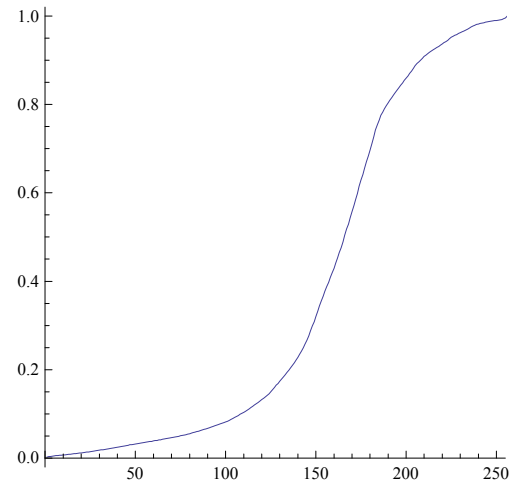
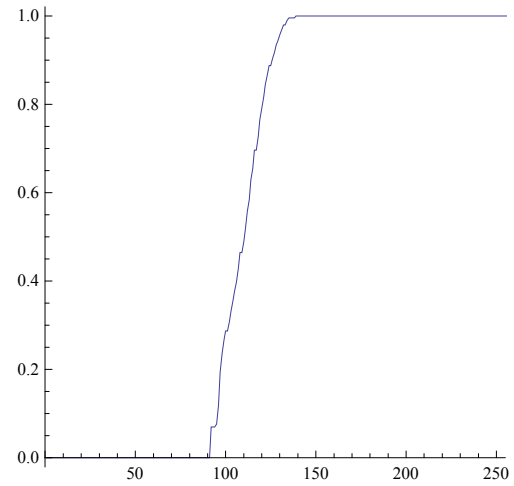
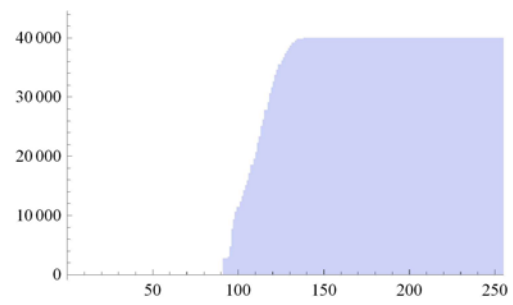
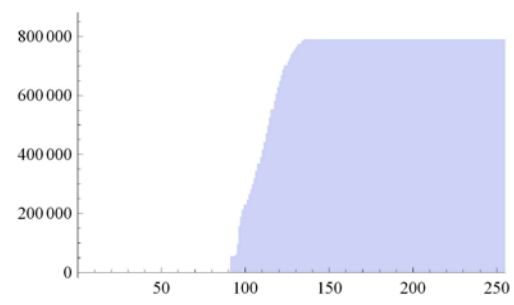
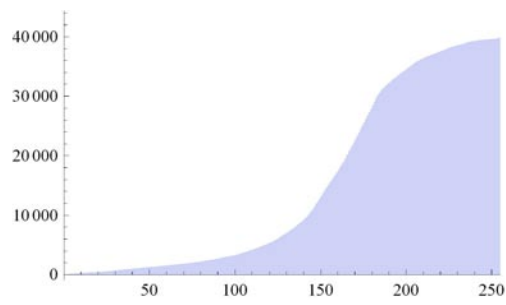


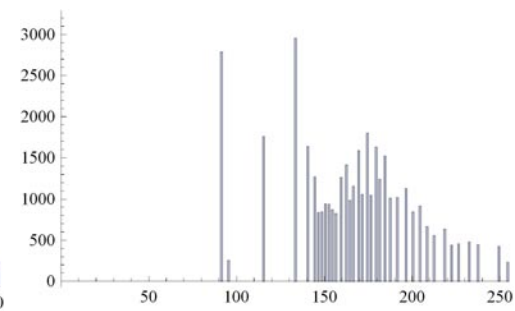
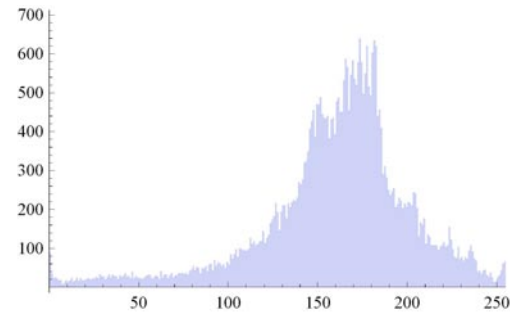
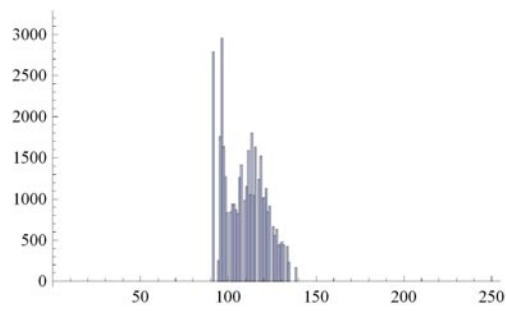
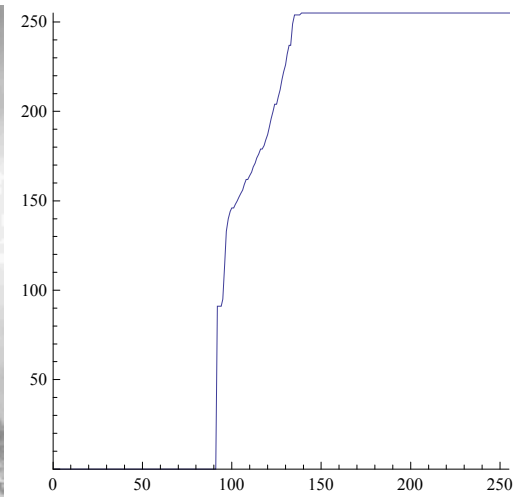


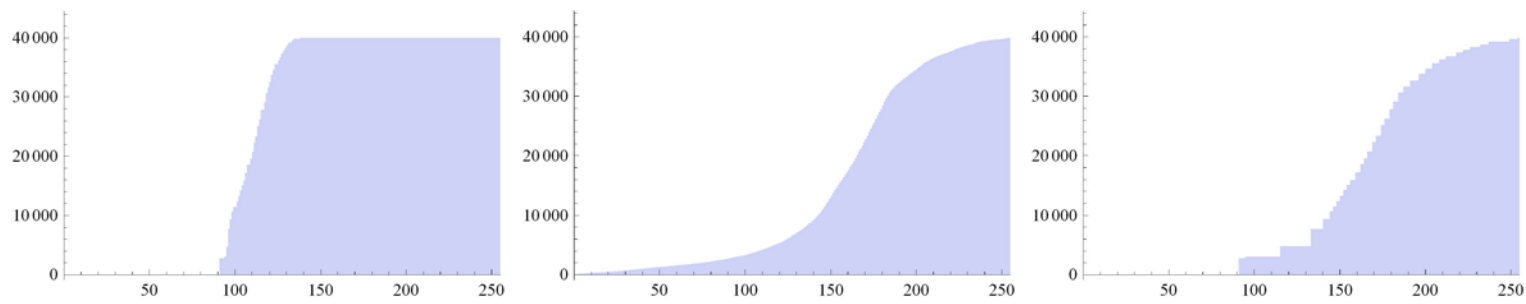
```
histogrammanpassung[histogrammanpassung[ocelot, pollen], ocelot];
```





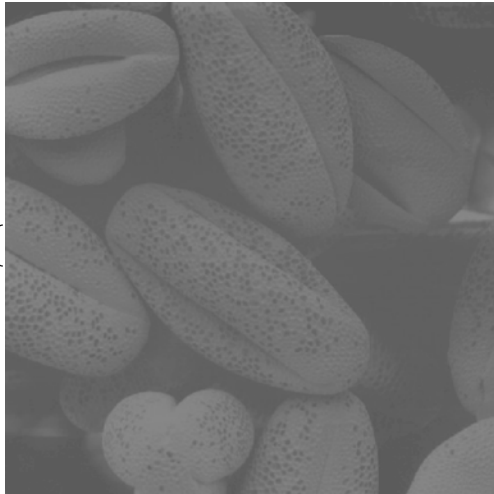




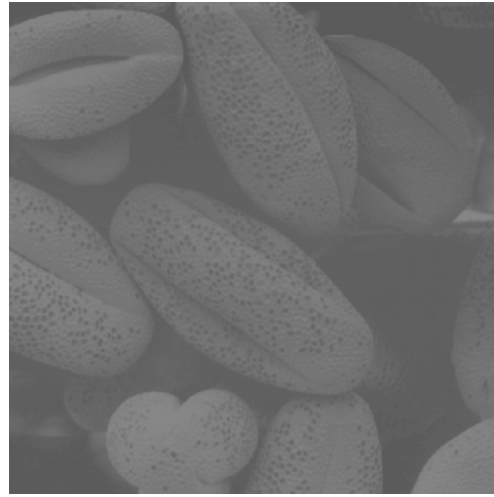


Die Funktionalität der Histogrammanpassung ist in der Funktion `HistogramTransform` eingebaut:

```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[pollen, ocelot]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[ocelot, pollen]
```



HistogramTransform behandelt mehrkanalige Bilder kanalweise:

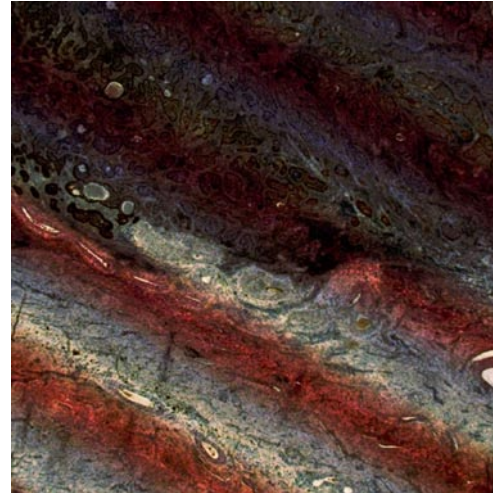
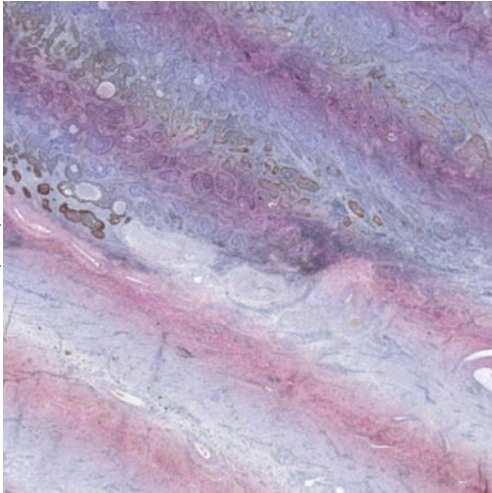
```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[ExampleData[{"TestImage", "Girl"}], ExampleData[{"TestImage", "Lena"}]]
```



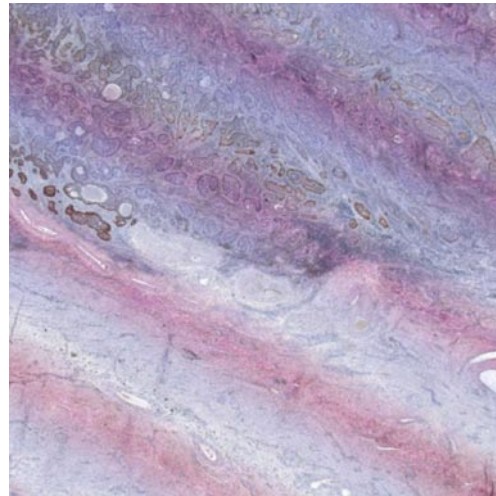
```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[
  ExampleData[{"TestImage", "Lena"}], ExampleData[{"TestImage", "Girl"}]]
```



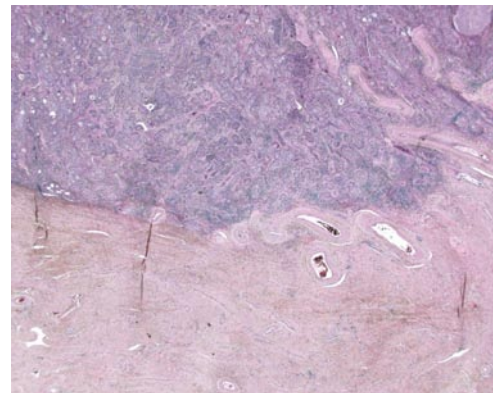
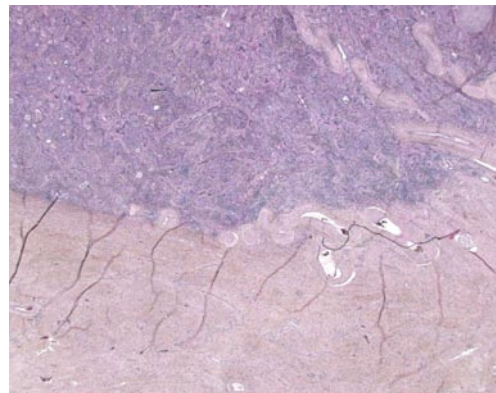
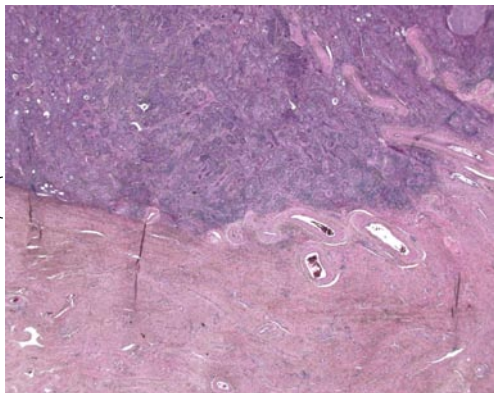
```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[
  testbild, ExampleData[{"TestImage", "Girl"}]]
```



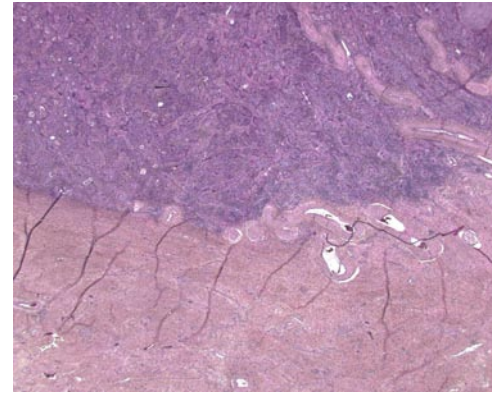
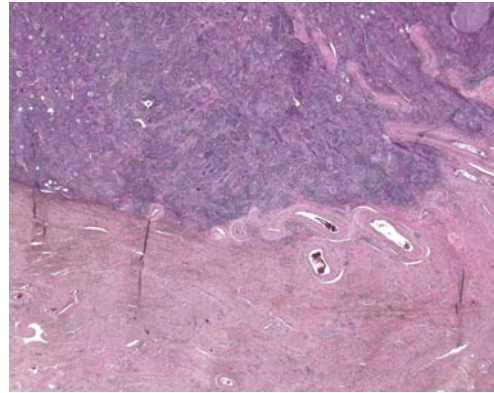
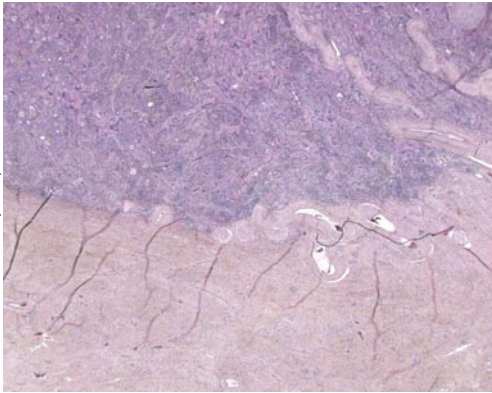

```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[
  ExampleData[{"TestImage", "Girl"}], testbild]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[zervixhel, zervixhe2]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[zervixhe2, zervixhe1]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[ExampleData[{"TestImage", "Girl"}], ExampleData[{"TestImage", "Girl2"}]]
```




```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[
ExampleData[{"TestImage", "Girl12"}], ExampleData[{"TestImage", "Girl"}]]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[
ExampleData[{"TestImage", "Girl13"}], ExampleData[{"TestImage", "Girl"}]]
```



```
ImageMeasurements[ExampleData[{"TestImage", "Girl3"}], "Mean"]
```

```
ImageMeasurements[ExampleData[{"TestImage", "Girl"}], "Mean"]
```

```
{0.506738, 0.389284, 0.490978}
```

```
{0.29736, 0.206114, 0.181588}
```

```
ImageMeasurements[ExampleData[{"TestImage", "Girl3"}], "StandardDeviation"]
```

```
ImageMeasurements[ExampleData[{"TestImage", "Girl"}], "StandardDeviation"]
```

```
{0.245105, 0.210102, 0.15438}
```

```
{0.17034, 0.165799, 0.151451}
```

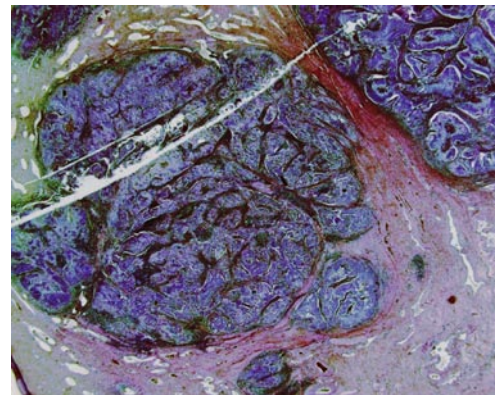
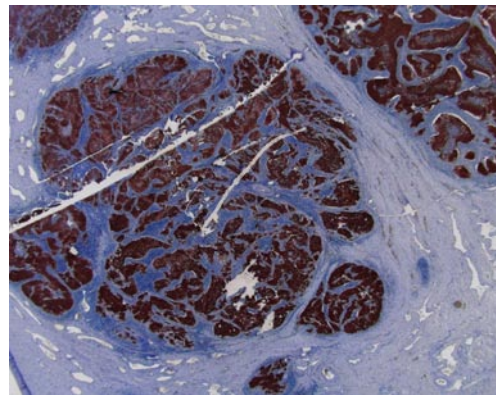
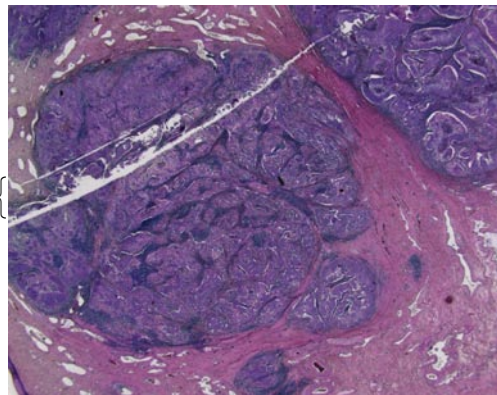
```
ImageMeasurements[HistogramTransform[ExampleData[{"TestImage", "Girl3"}], ExampleData[{"TestImage", "Girl"}]], "Mean"]
```

```
ImageMeasurements[HistogramTransform[ExampleData[{"TestImage", "Girl3"}], ExampleData[{"TestImage", "Girl"}]], "StandardDeviation"]
```

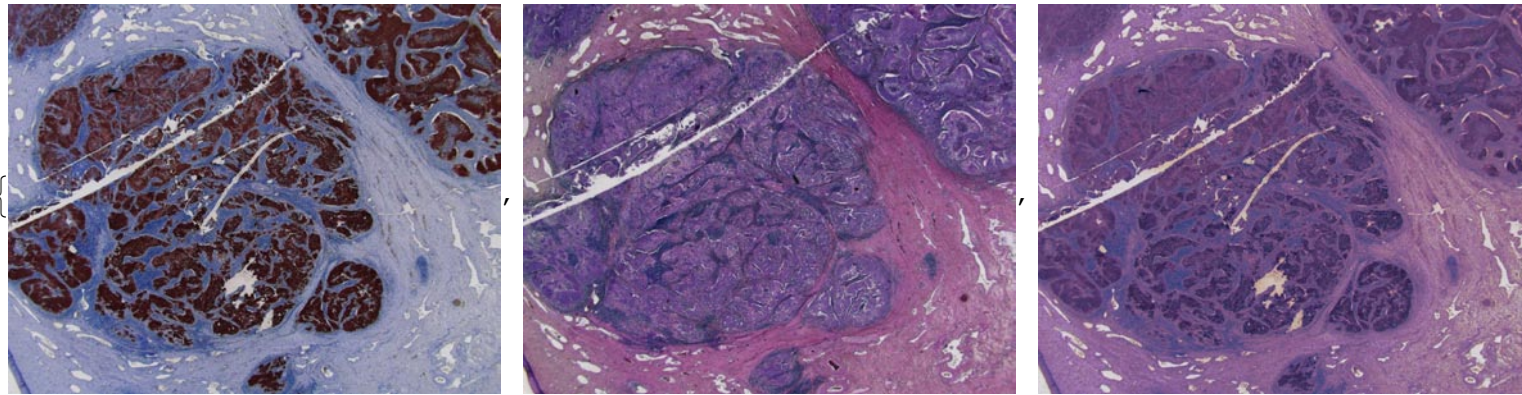
```
{0.297564, 0.206518, 0.181469}
```

```
{0.170103, 0.166532, 0.151109}
```

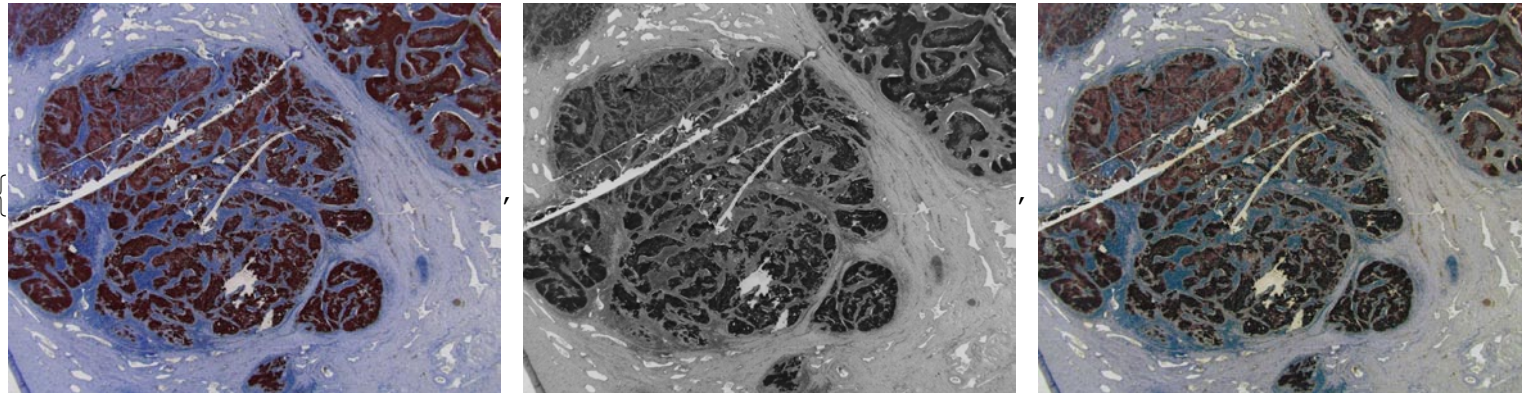
```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[hebild, pl6bild]
```



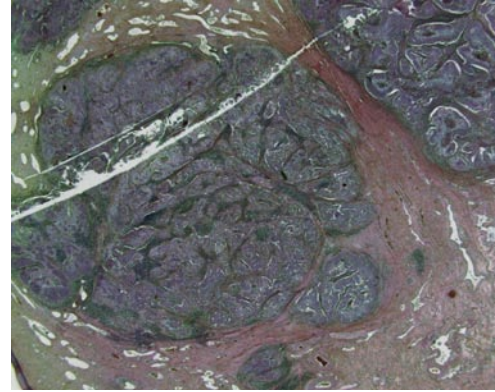
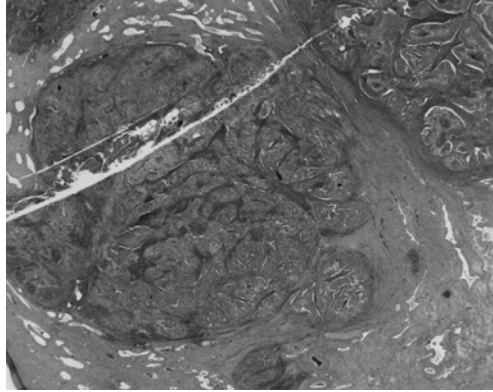
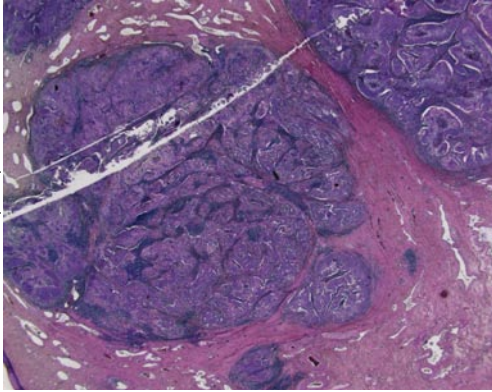

```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[p16bild, hebild]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[p16bild, ColorConvert[p16bild, "Graylevel"]]
```



```
{Show[#1, ImageSize → 256], Show[#2, ImageSize → 256], Show[HistogramTransform[#1, #2], ImageSize → 256]} &[  
  hebild, ColorConvert[hebild, "Graylevel"]]
```



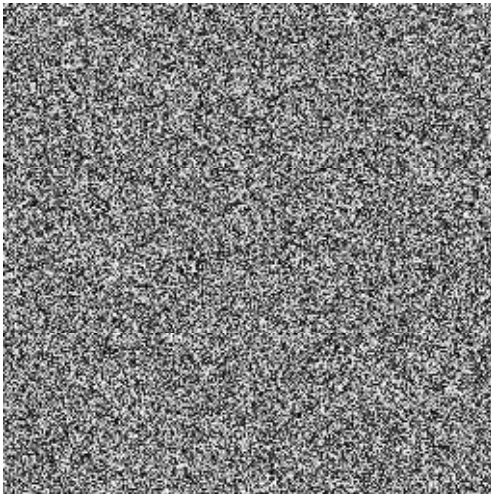
Aus 11. Graylevel-Co-Occurrence-Matrix

- Hilfsmittel für die Analyse von texturellen (musterbezogenen) Bildeigenschaften
- geordnete Paare von Intensitätswerten anhand einer definierten binären Relation erfaßt

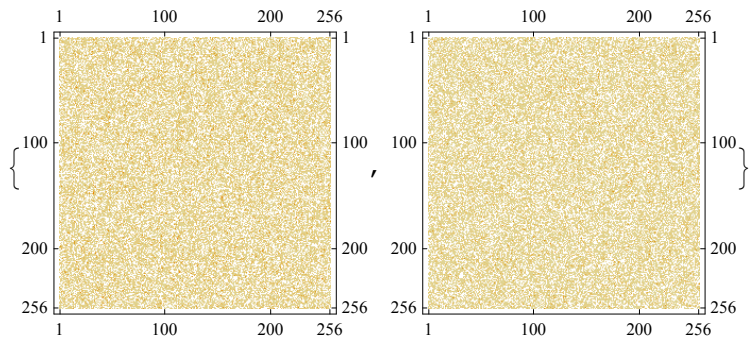
$$C_{\Delta x, \Delta y}(i, j) = \sum_{p=1}^n \sum_{q=1}^m \begin{cases} 1 & \text{falls } I(p, q) == i \text{ und } I(p + \Delta x, q + \Delta y) == j \\ 0 & \text{sonst} \end{cases}$$

- zusammenhängend besetzte Hauptdiagonalen weisen auf homogene Bildbereiche hin
- Einträge weitab der Hauptdiagonalen deuten auf starke lokale Kontraste hin

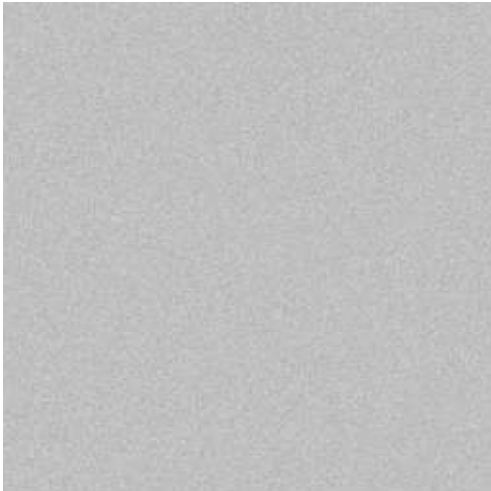
randombild



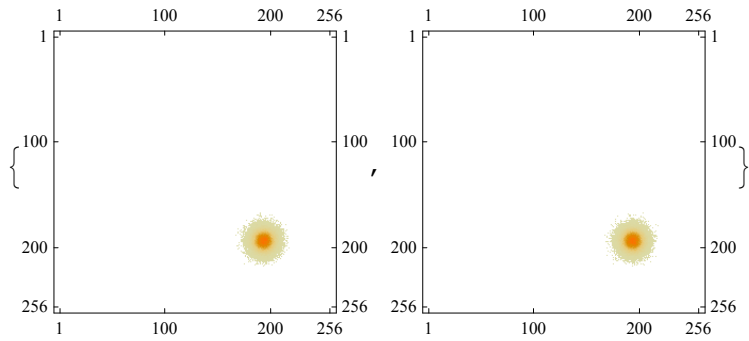
```
{MatrixPlot[ImageCooccurrence[#, 256, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}]],  
  MatrixPlot[ImageCooccurrence[#, 256, {{0, 0, 0}, {0, 0, 0}, {0, 1, 0}}]]} &[randombild]
```



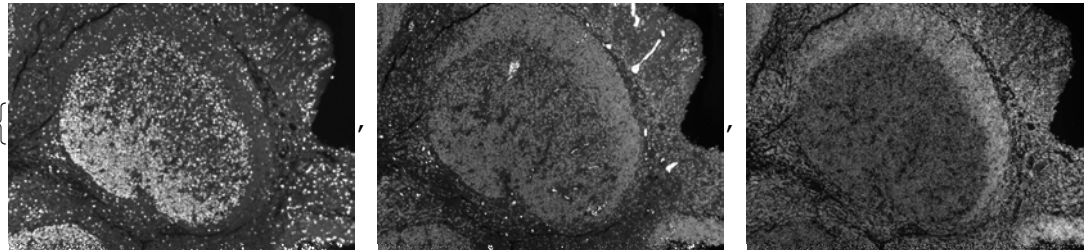
rauschbild



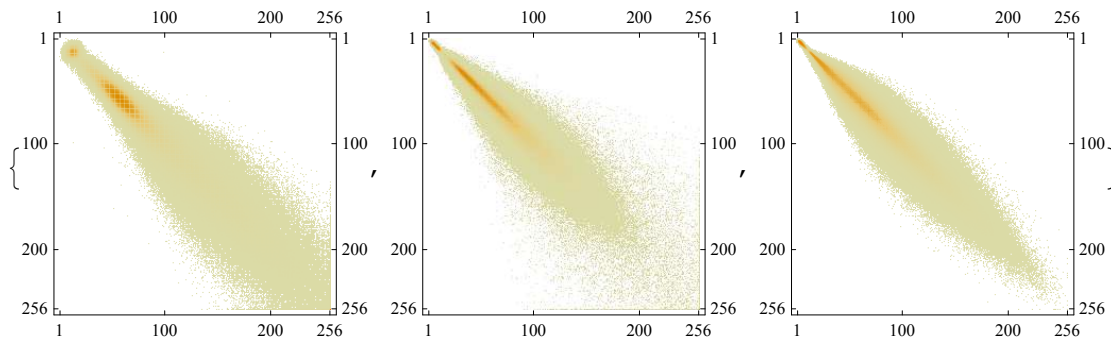
```
{MatrixPlot[ImageCooccurrence[#, 256, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}]],  
  MatrixPlot[ImageCooccurrence[#, 256, {{0, 0, 0}, {0, 0, 0}, {0, 1, 0}}]]} &[rauschbild]
```



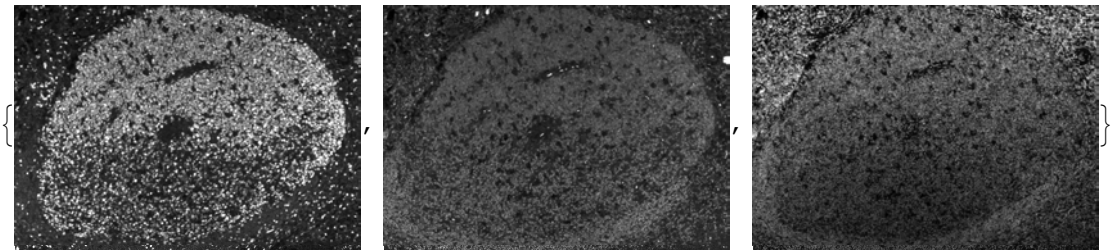
```
ColorSeparate[Ton2CD21dreikanalausgleichF1]
```



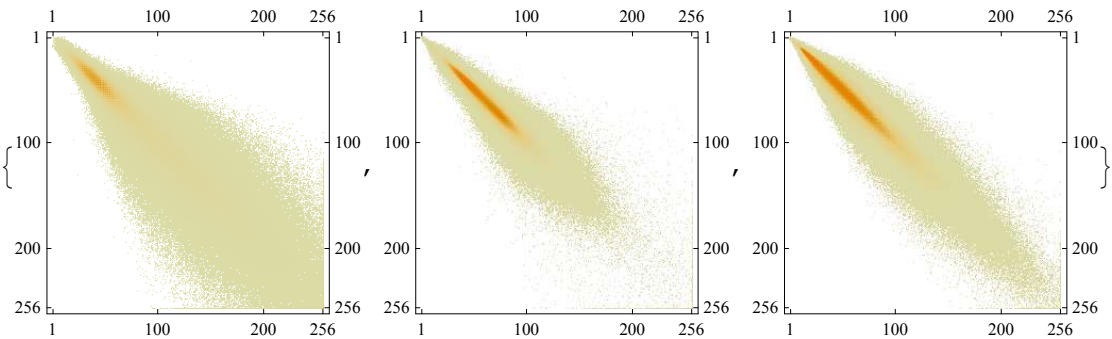
```
MatrixPlot[ImageCooccurrence[#, 256, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}]] & /@ ColorSeparate[Ton2CD21dreikanalausgleichF1]
```



ColorSeparate[Ton3CD21dreikanalausgleichF2]

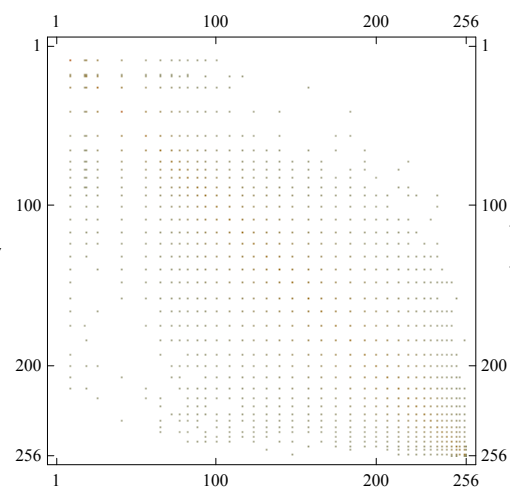
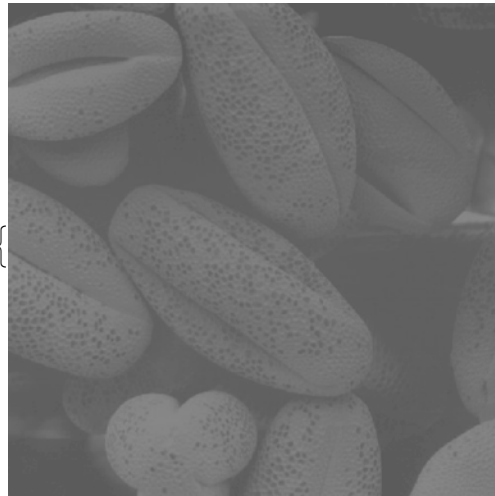


MatrixPlot[ImageCooccurrence[#, 256, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}]] & /@ ColorSeparate[Ton3CD21dreikanalausgleichF2]



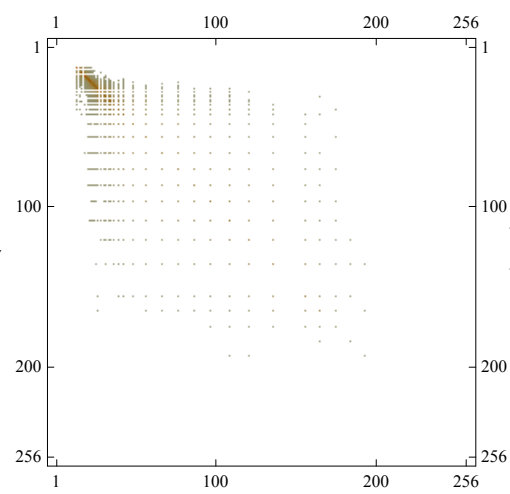
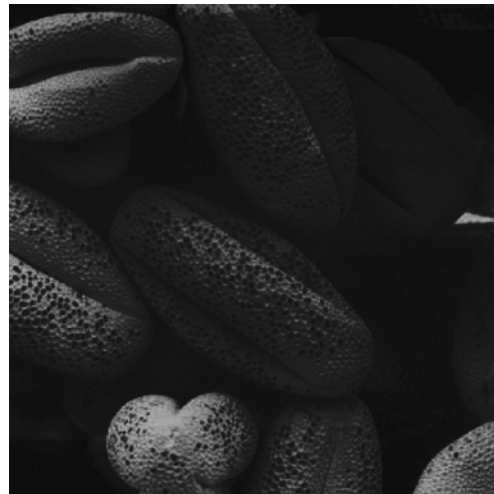
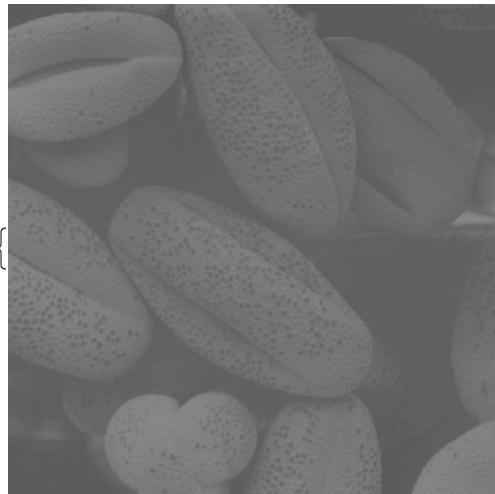

```
Show[#, ImageSize -> 256] & /@
```

```
Function[{bild}, Flatten@{bild, {#, MatrixPlot[ImageCooccurrence[#, 256]]} & [HistogramTransform[bild]]}] [pollen]
```



```
Show[#, ImageSize -> 256] & /@
```

```
Function[{bild, ref}, Flatten@{bild, {#, MatrixPlot[ImageCooccurrence[#, 256]]} & [HistogramTransform[bild, ref]]}] [pollen, ExampleData[{"TestImage", "U2"}]]
```



Analyse der Grauwertübergangsmatrix mittels Haralick'scher Merkmale (insgesamt 14)

Haralick-Features (Implementation von Felix Weiske und Tobias Finze)

```

Manipulate[
  Switch[feat,
    1, {fimg1, fimg2} = {haralick1[img1, graylevelsteps, nbh], haralick1[img2, graylevelsteps, nbh]};
    label = "angular second momentum (energy) = ";
    ,
    2, {fimg1, fimg2} = {haralick2[img1, graylevelsteps, nbh], haralick2[img2, graylevelsteps, nbh]};
    label = "contrast = ";
    ,
    3, {fimg1, fimg2} = {haralick3[img1, graylevelsteps, nbh], haralick3[img2, graylevelsteps, nbh]};
    label = "correlation = ";
    ,
    4, {fimg1, fimg2} = {haralick4[img1, graylevelsteps, nbh], haralick4[img2, graylevelsteps, nbh]};
    label = "variance = ";
    ,
    9, {fimg1, fimg2} = {haralick9[img1, graylevelsteps, nbh], haralick9[img2, graylevelsteps, nbh]};
    label = "entropy = ";
  ];
  Grid[
    {{MatrixPlot[ImageCooccurrence[img1, graylevelsteps, nbh], ImageSize → Medium],
      MatrixPlot[ImageCooccurrence[img2, graylevelsteps, nbh], ImageSize → Medium]}},
    {label <> ToString[fimg1], label <> ToString[fimg2]}
  ],
  {{graylevelsteps, 32, "Grauwertstufen:"}, 1, 256, 1, Appearance → "Labeled"},
  Row[{
    Control[{{img1, rauschbild, "Bild 1:"}, imglist, ImageSize → Tiny, ControlType → PopupMenu}],
    Control[{{img2, randombild, "Bild 2:"}, imglist, ImageSize → Tiny, ControlType → PopupMenu}]
  ], Spacer[20]],
  {{nbh, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}, "3x3-Nachbarschaft: "},
  {{{{0, 0, 0}, {1, 0, 0}, {0, 0, 0}} → "links", {{1, 0, 0}, {0, 0, 0}, {0, 0, 0}} → "links oben", {{0, 1, 0}, {0, 0, 0}, {0, 0, 0}} → "oben",
    {{0, 0, 1}, {0, 0, 0}, {0, 0, 0}} → "rechts oben", {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}} → "rechts", {{0, 0, 0}, {0, 0, 0}, {0, 0, 1}} → "rechts unten",
    {{0, 0, 0}, {0, 0, 0}, {0, 1, 0}} → "unten", {{0, 0, 0}, {0, 0, 0}, {1, 0, 0}} → "links unten"}}, {{feat, 1, "Haralick-Feature: "},
  {1 → "angular second momentum", 2 → "contrast", 3 → "correlation", 4 → "variance", 9 → "entropy"}, ControlType → PopupMenu]]

```

Grauwertstufen: 32

Bild 1:



Bild 2:



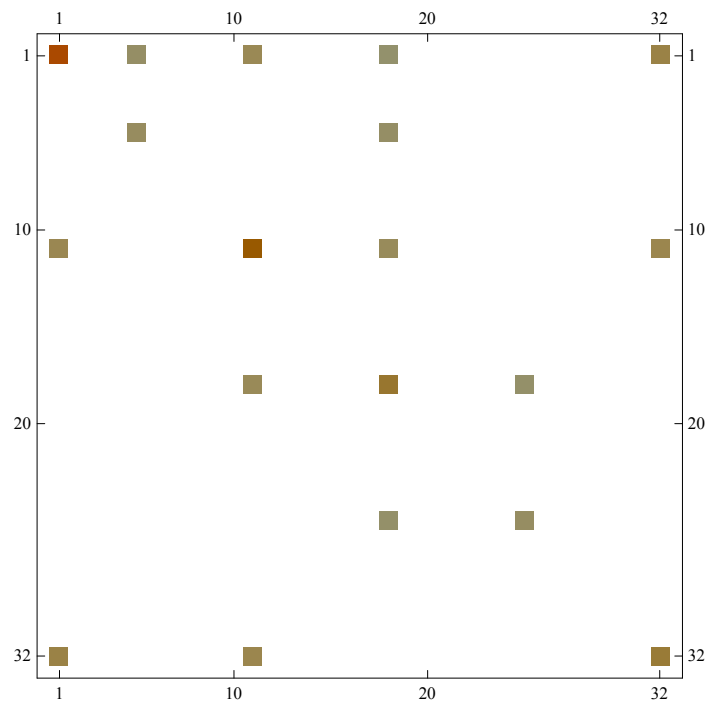
3x3-Nachbarschaft:

rechts

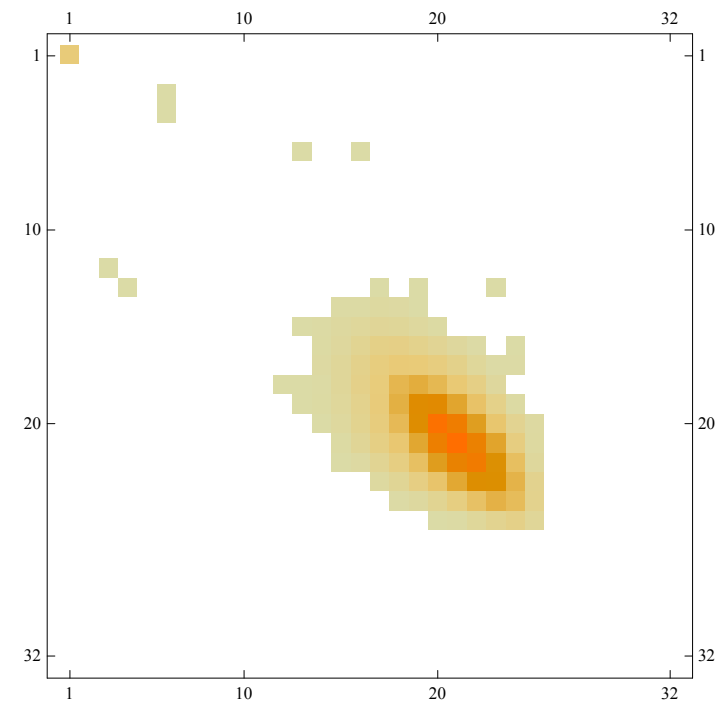


Haralick-Feature:

angular second momentum



```
angular second momentum (energy) =
  haralick1[-Image-, 32, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}]
```



```
angular second momentum (energy) =
  haralick1[-Image-, 32, {{0, 0, 0}, {0, 0, 1}, {0, 0, 0}}]
```

Aus 12. Lineare diskrete verschiebungsinvariante Filter

- als diskrete Faltung: $G' = O * G$

$$- G'_{m,n} = \sum_{i=-r}^r \sum_{j=-r}^r O_{i,j} G_{m-i,n-j}$$

- Verschiebungsinvarianz: wenn Signal verschoben, dann Ergebnis des Operators ebenso verschoben

```
maxwellenzahl = 0.5;
maske = Round[Rescale[Sign[Table[(x^2 + y^2), {x, -256, 256}, {y, -256, 256}] - 256 * (256 + 1)], {1, -1}]];
wellen = Table[Cos[(x^2 + y^2) / 256 * π * maxwellenzahl], {x, -256, 256}, {y, -256, 256}];
wellenbild = Image[Rescale[maske * wellen, {-1, 1}]];

Show[wellenbild, ImageSize -> 513]

ListPlot[Table[Cos[x * π * x * maxwellenzahl / 256], {x, 0, 256}], Filling -> Axis]

Plot[Cos[x * π * x * maxwellenzahl / 256], {x, 0, 256}]
```

Transferfunktion → Diskrete Fouriertransformation (DFT)

1 D : eindimensionaler Vektor mit (potentiell) komplexen Elementen : $f = (f_0, f_1, \dots, f_{M-1})^T$

Hintransformation : $\hat{f}_u = \sum_{m=0}^{M-1} f_m e^{\left(\frac{-2\pi i m u}{M}\right)}$ mit $u = 0 \dots M - 1$

Rücktransformation : $f_m = \frac{1}{M} \sum_{u=0}^{M-1} \hat{f}_u e^{\left(\frac{2\pi i m u}{M}\right)}$ mit $m = 0 \dots M - 1$

Um eine Faltungsmaske in die obige Vektordarstellung zu bringen, ist eine Umsortierung erforderlich :

Maske (..., f_{-2} , f_{-1} , f_0 , f_1 , f_2 , ...) wird wegen der negativen Indizes entsprechend der aktuellen Signallänge M zyklisch verschoben in (f_0 , f_1 , f_2 , ..., ..., f_{-2} , f_{-1}) und neu indiziert von 0 ... $M - 1$: (f_0 , f_1 , f_2 , ..., f_{M-2} , f_{M-1})

Beispiel : Binomialfilter

$$b = \left(\frac{1}{4}, \frac{1}{2}, \frac{1}{4} \right)^T$$

$$b_0 = \frac{1}{2}$$

$$b_1 = \frac{1}{4}$$

$$b_{M-1} = \frac{1}{4}$$

$$\hat{b}_u = \frac{1}{2} + \frac{1}{4} e^{\left(\frac{-2\pi i u}{M} \right)} + \frac{1}{4} e^{\left(\frac{-2\pi i (M-1) u}{M} \right)}$$

$$\hat{b}_u = \frac{1}{2} + \frac{1}{4} e^{\left(\frac{-2\pi i u}{M} \right)} + \frac{1}{4} e^{\left(-2i\pi u + \frac{2i\pi u}{M} \right)}$$

$$\hat{b}_u = \frac{1}{2} + \frac{1}{4} e^{\left(\frac{-2\pi i u}{M} \right)} + \frac{1}{4} e^{(-2i\pi u)} e^{\left(\frac{2i\pi u}{M} \right)}$$

`Simplify`[$e^{(-2 i \pi u)}$, `Element`[u , `Integers`]]

1

`Solve`[$e^{(-2 i \pi u)} == 1$, u]

{{ $u \rightarrow \text{ConditionalExpression}[-C[1], C[1] \in \text{Integers}]$ }}

$$\hat{b}_u = \frac{1}{2} + \frac{1}{4} e^{\left(\frac{-2\pi i u}{M} \right)} + \frac{1}{4} e^{\left(\frac{2i\pi u}{M} \right)}$$

$$e^{\left(\frac{-2\pi i u}{M}\right)} // \text{ExpToTrig}$$

$$\cos\left[\frac{2\pi u}{M}\right] - i \sin\left[\frac{2\pi u}{M}\right]$$

$$e^{\left(\frac{2\pi i u}{M}\right)} // \text{ExpToTrig}$$

$$\cos\left[\frac{2\pi u}{M}\right] + i \sin\left[\frac{2\pi u}{M}\right]$$

*(*Additionstheorem cosx-isinx+cosx+isinx*)*

$$e^{\left(\frac{-2\pi i u}{M}\right)} + e^{\left(\frac{2\pi i u}{M}\right)} // \text{ExpToTrig}$$

$$2 \cos\left[\frac{2\pi u}{M}\right]$$

$$e^{-i x} + e^{i x} // \text{ExpToTrig}$$

$$2 \cos[x]$$

$$\frac{1}{2} \left(1 + \frac{1}{2} e^{\left(\frac{-2\pi i u}{M}\right)} + \frac{1}{2} e^{\left(\frac{2\pi i u}{M}\right)} \right) // \text{ExpToTrig}$$

$$\frac{1}{2} + \frac{1}{2} \cos\left[\frac{2\pi u}{M}\right]$$

$$\hat{b}_u = \frac{1}{2} \left(\cos\left(\frac{2\pi u}{M}\right) + 1 \right)$$

$$\hat{b}_u = \frac{1}{2} (\cos(2\pi k) + 1)$$

$$\frac{1}{2} + \frac{1}{2} \cos\left[\frac{2\pi u}{M}\right] // \text{Simplify}$$

$$\cos\left[\frac{\pi u}{M}\right]^2$$

Das Verhältnis u/M wird als Wellenzahl $k = 0 \dots 0.5$ bezeichnet

$$\frac{1}{2} + \frac{1}{2} \cos[2\pi k] \quad // \text{Simplify}$$

$$\cos[k\pi]^2$$

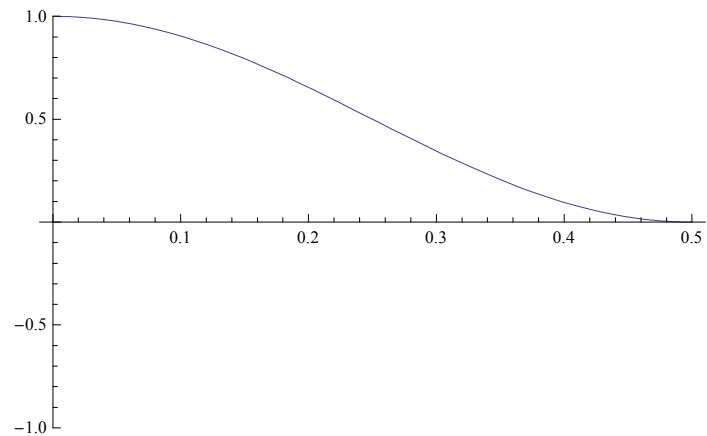
Nullstelle(n) der Transferfunktion $\hat{g}_k$ des Boxfilters $g = \left(\frac{1}{4}, \frac{1}{2}, \frac{1}{4}\right)^T$

$$\text{Solve}[1/2 * (1 + \cos[2\pi k]) == 0 \ \&\& \ 0 \leq k \leq 1/2, k]$$

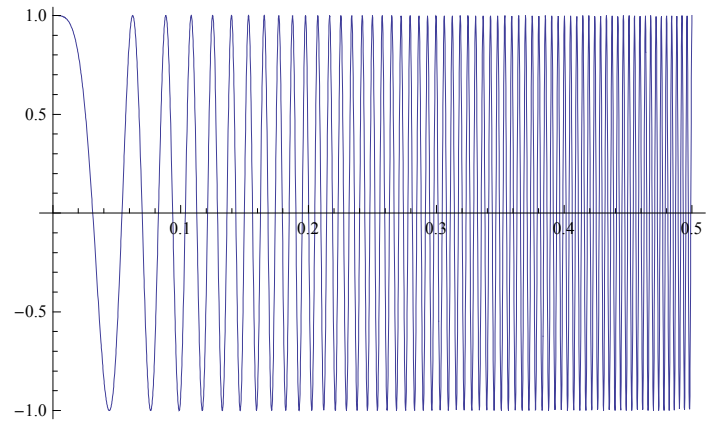
$$\left\{ \left\{ k \rightarrow \frac{1}{2} \right\}, \left\{ k \rightarrow \frac{1}{2} \right\} \right\}$$

Plot der Transferfunktion $\hat{g}_k$ des Boxfilters $g = \left(\frac{1}{4}, \frac{1}{2}, \frac{1}{4}\right)^T$

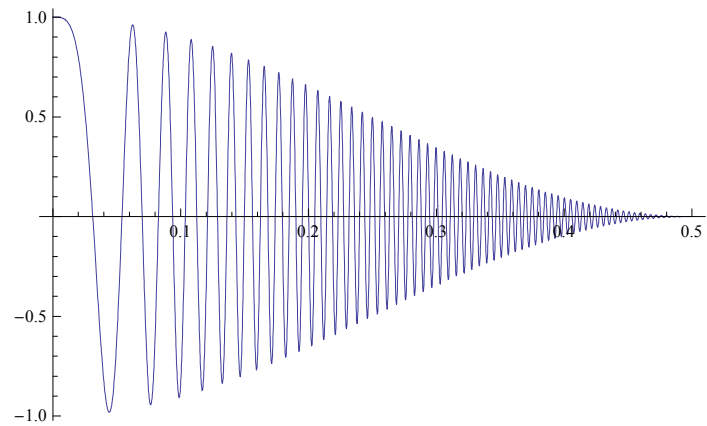
$$\text{Plot}[1/2 * (1 + \cos[2\pi k]), \{k, 0, \text{maxwellenzahl}\}, \text{PlotRange} \rightarrow \{\text{Full}, \{-1, 1\}\}]$$



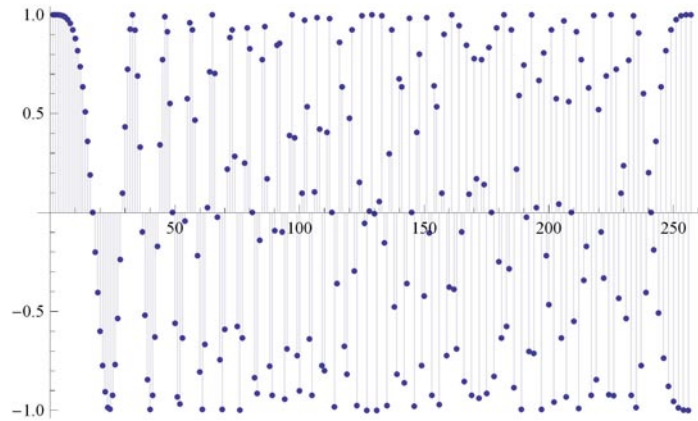
```
Plot[Cos[x *  $\pi$  * x / maxwellenzahl * r], {x, 0, maxwellenzahl}]
```



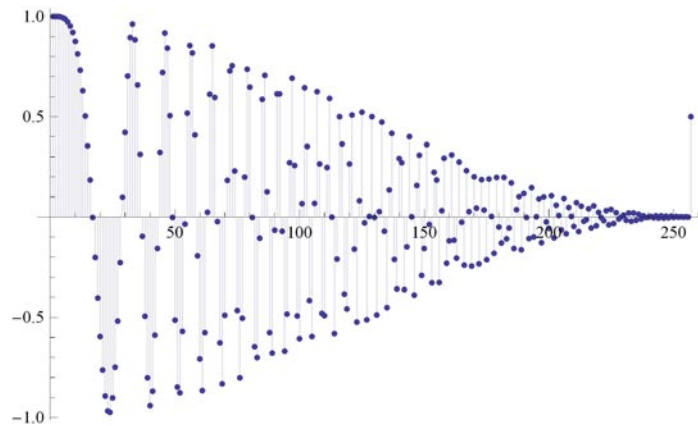
```
Plot[Cos[k *  $\pi$  * k / maxwellenzahl * r] * (1 / 2 * (1 + Cos[2  $\pi$  k])), {k, 0, maxwellenzahl}]
```




```
ListPlot[Table[Cos[x * π * x * maxwellenzahl / r], {x, 0, r}], Filling → Axis]
```



```
ListPlot[ListConvolve[{1/4, 1/2, 1/4}, Table[Cos[x * π * x * maxwellenzahl / r], {x, 0, r}], 2], Filling → Axis]
```



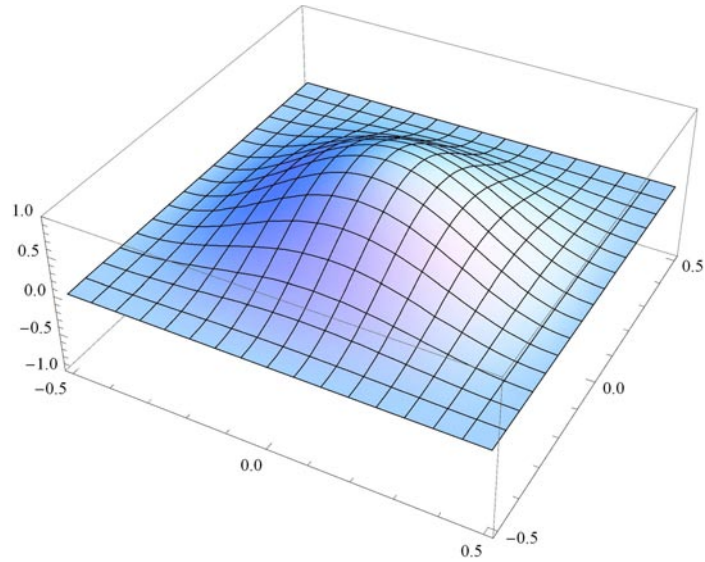
Wie sieht das in 2D für das Ringwellenbild aus?

2 D – Hintransformation : $\hat{f}_{u,v} = \sum_{m=0}^{M-1} \sum_{n=0}^{N-1} f_{m,n} e^{\left(\frac{-2\pi i m u}{M}\right)} e^{\left(\frac{-2\pi i n v}{N}\right)}$ mit $u = 0 \dots M - 1$ und $v = 0 \dots N - 1$

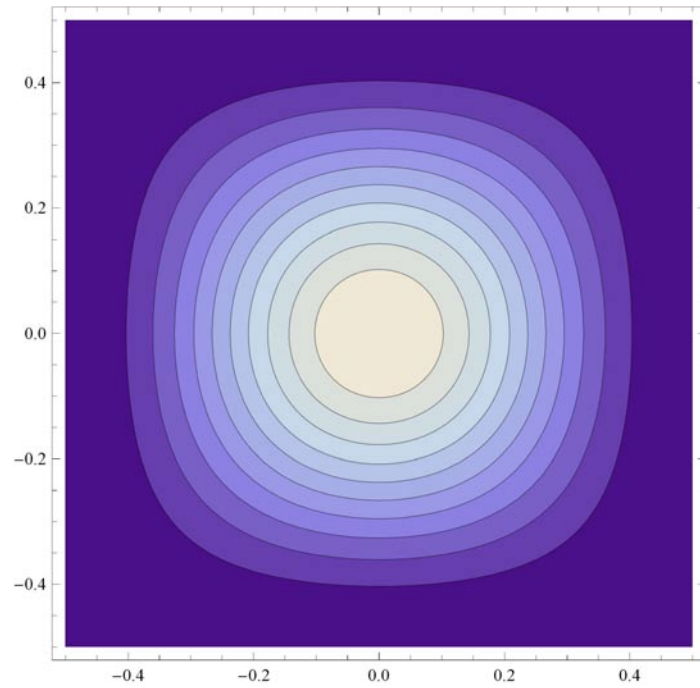
2 D – Rücktransformation : $f_{m,n} = \frac{1}{MN} \sum_{u=0}^{M-1} \sum_{v=0}^{N-1} \hat{f}_{u,v} e^{\left(\frac{2\pi i m u}{M}\right)} e^{\left(\frac{2\pi i n v}{N}\right)}$ mit $m = 0 \dots M - 1$ und $n = 0 \dots N - 1$

Die Verhältnisse u/M bzw. v/N werden als Wellenzahl $k_1 = 0 \dots 0.5$ bzw. $k_2 = 0 \dots 0.5$ bezeichnet.

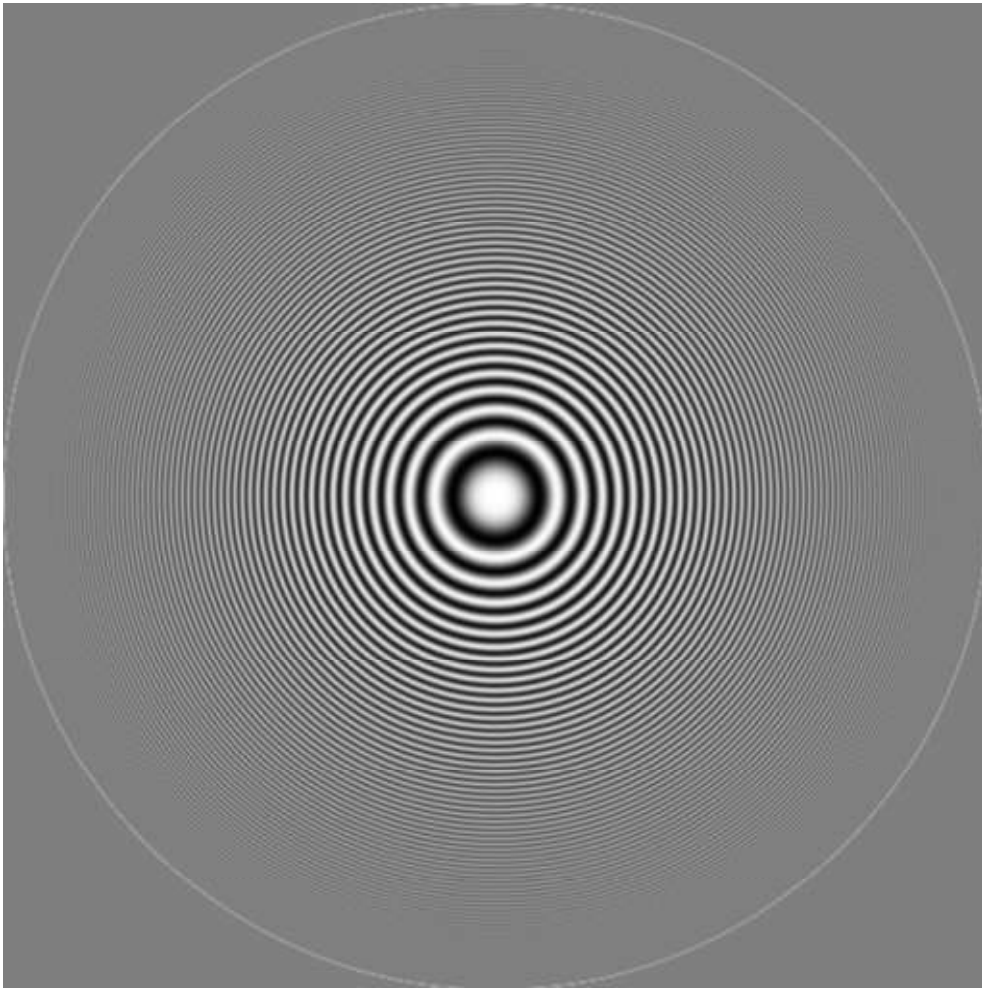
```
Plot3D[1/2 (1 + Cos[2 k1 π]) * 1/2 (1 + Cos[2 k2 π]), {k1, -maxwellenzahl, maxwellenzahl},  
{k2, -maxwellenzahl, maxwellenzahl}, PlotRange → {Full, Full, {-1, 1}}]
```



```
ContourPlot[1 / 2 (1 + Cos[2 k1 π]) * 1 / 2 (1 + Cos[2 k2 π]),  
{k1, -maxwellenzahl, maxwellenzahl}, {k2, -maxwellenzahl, maxwellenzahl}, Contours → 10]
```



```
Image[ListConvolve[Transpose[{{1 / 4, 1 / 2, 1 / 4}}].{{1 / 4, 1 / 2, 1 / 4}}, ImageData[wellenbild], 2]]
```



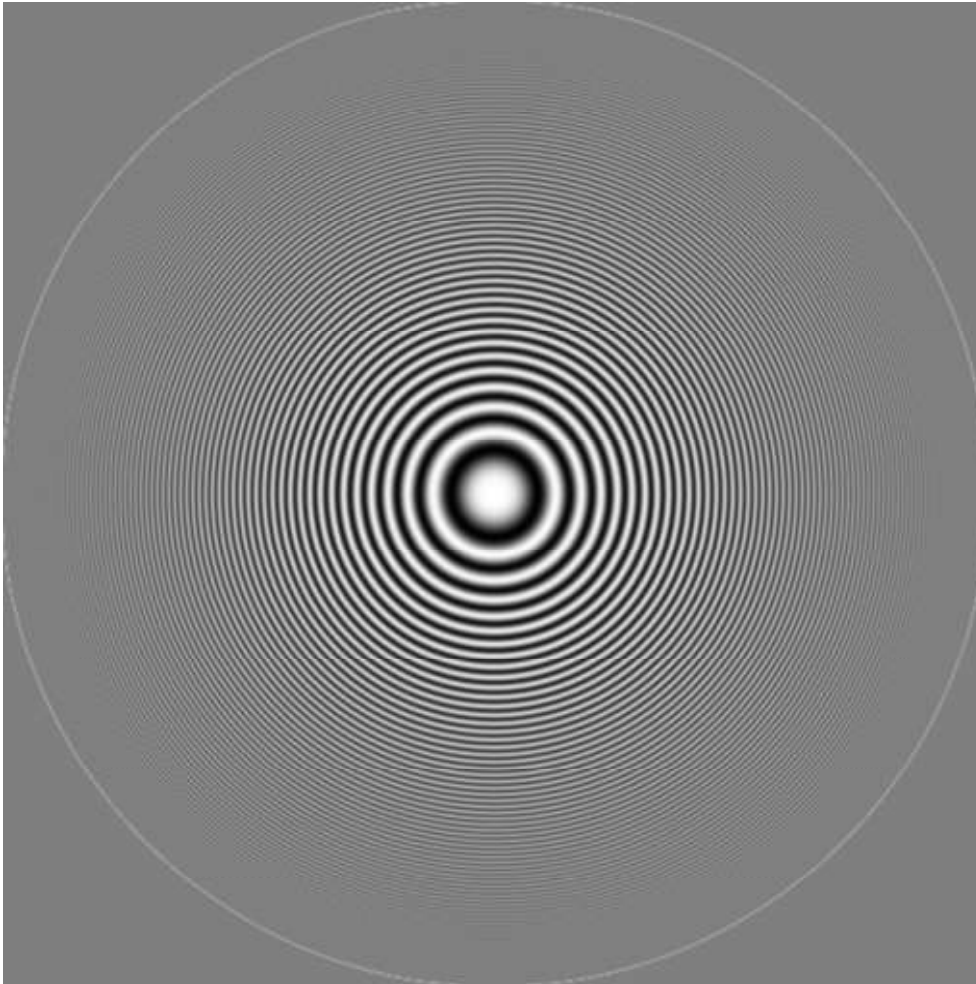
Separierbarkeit

Ein diskretes Filter in 2D, das als äußeres Produkt zweier 1D-Filter gebildet werden kann, kann ebenso durch sequentielle Anwendung beider 1D-Filter angewendet werden. Die Matrix des “Filterkerns” hat den Rang 1. Dadurch kommen anstelle von je N^2 Lesezugriffen und Multiplikationen sowie $N^2 - 1$ Additionen nur $2 N$ Lesezugriffe und Multiplikationen sowie $2 (N - 1)$ Additionen zustande.

```
MatrixRank@(Transpose[{{1 / 4, 1 / 2, 1 / 4}}].{{1 / 4, 1 / 2, 1 / 4}})
```

1


```
Image[ListConvolve[{{1 / 4, 1 / 2, 1 / 4}}, ListConvolve[Transpose@{{1 / 4, 1 / 2, 1 / 4}}, ImageData[wellenbild], {2, 1}], {2, 1}]]
```



```
ClearSystemCache[];
Image[ListConvolve[Transpose[{{1 / 4, 1 / 2, 1 / 4}}].{{1 / 4, 1 / 2, 1 / 4}}, ImageData[wellenbild], {2, 2}]] // AbsoluteTiming // First
0.031200
```

```
ClearSystemCache[];
Image[ListConvolve[N@{{1 / 4, 1 / 2, 1 / 4}}, ListConvolve[Transpose@{{1 / 4, 1 / 2, 1 / 4}}, ImageData[wellenbild], {2, 1}], {2, 1}]] //
  AbsoluteTiming // First
0.046800
```

Leider ist der Rechenzeitgewinn durch Separierbarkeit damit nicht demonstrierbar.

```
ClearSystemCache[];  
ImageConvolve[wellenbild, Transpose[{{1 / 4, 1 / 2, 1 / 4}}].{{1 / 4, 1 / 2, 1 / 4}}] // AbsoluteTiming // First  
0.140400
```

```
ClearSystemCache[];  
ImageConvolve[ImageConvolve[wellenbild, Transpose@{{1 / 4, 1 / 2, 1 / 4}}], {{1 / 4, 1 / 2, 1 / 4}}] // AbsoluteTiming // First  
0.062400
```

Jedoch mit ImageConvolve kann man den Gewinn belegen (dennoch langsamer, als oben)

Aber die Gleichheit der Lösung (bis auf Stellen am äußersten Rand):

```
Image@Rescale[ListConvolve[Transpose[{{1 / 4, 1 / 2, 1 / 4}}].{{1 / 4, 1 / 2, 1 / 4}}, ImageData[wellenbild], 2] -  
ListConvolve[{{1 / 4, 1 / 2, 1 / 4}}, ListConvolve[Transpose@{{1 / 4, 1 / 2, 1 / 4}}, ImageData[wellenbild], {2, 1}], {1, 2}]]
```



Automatisierte analytische Berechnung der 1D-DFT

```
Clear[transferfunktion];
transferfunktion[g_List] := Module[{resultat, u, mm, m},
  resultat = (FullSimplify[Sum[g[[Mod[m + (Length[g] - 1) / 2, Length[g]] + 1]] *
    Exp[-2  $\pi$  i * Join[Table[i, {i, 0, (Length[g] - 1) / 2, 1}], Table[mm - i, {i, (Length[g] - 1) / 2, 1, -1}]] [[m + 1]] u / mm],
    {m, 0, Length[g] - 1, 1}], Assumptions  $\rightarrow$  Element[u, Integers]] /. u / mm  $\rightarrow$  k1);
  Return[resultat];
];
```

Automatisierte analytische Berechnung der 2D-DFT

```
Clear[transferfunktion2d];
(*schnellere Variante -(M-1)/2 ... (M-1)/2 und -(N-1)/2 ... (N-1)/2*)
transferfunktion2d[g_List] := Module[{resultat, u, v, mm, nn, m, n},
  resultat =
    ((
      FullSimplify[
        FullSimplify[
          Sum[
            Sum[
              g[[m + (Dimensions[g][[1]] + 1) / 2, n + (Dimensions[g][[2]] + 1) / 2]] *
                Exp[-2  $\pi$  i m * u / mm] *
                Exp[-2  $\pi$  i n * v / nn],
              {m, -(Dimensions[g][[1]] - 1) / 2, (Dimensions[g][[1]] - 1) / 2, 1}},
              {n, -(Dimensions[g][[2]] - 1) / 2, (Dimensions[g][[2]] - 1) / 2, 1}},
            Assumptions  $\rightarrow$  Element[u, Integers]],
          Assumptions  $\rightarrow$  Element[v, Integers]]
        /. u / mm  $\rightarrow$  k1)
      /. v / nn  $\rightarrow$  k2
    );
  Return[FullSimplify[ComplexExpand[ExpToTrig[resultat]] /. u / mm  $\rightarrow$  k1 /. v / nn  $\rightarrow$  k2]];
];
```

Beispiele 1D-DFT:

3er Binomialfilter

```
binom[2]
transferfunktion[binom[2]]
transferfunktion[binom[2]] // TrigReduce
```

$$\left\{ \frac{1}{4}, \frac{1}{2}, \frac{1}{4} \right\}$$

$$\cos[\pi k_1]^2$$

$$\frac{1}{2} (1 + \cos[2 \pi k_1])$$

3er Boxfilter

```
box[3]
transferfunktion[box[3]] // TrigReduce
```

$$\left\{ \frac{1}{3}, \frac{1}{3}, \frac{1}{3} \right\}$$

$$\frac{1}{3} (1 + 2 \cos[2 \pi k_1])$$

2er Boxfilter

```
transferfunktion[{1/2, 1/2, 0}] // ExpToTrig
```

$$\frac{1}{2} + \frac{1}{2} \cos[2 \pi k_1] + \frac{1}{2} i \sin[2 \pi k_1]$$

```
transferfunktion[{0, 1/2, 1/2}] // ExpToTrig
```

$$\frac{1}{2} + \frac{1}{2} \cos[2 \pi k_1] - \frac{1}{2} i \sin[2 \pi k_1]$$


```
binom[4]
transferfunktion[binom[4]]
transferfunktion[binom[4]] // TrigReduce
```

$$\left\{ \frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16} \right\}$$

$$\cos[\pi k_1]^4$$

$$\frac{1}{8} (3 + 4 \cos[2 \pi k_1] + \cos[4 \pi k_1])$$

```
ableitungsymm
transferfunktion[ableitungsymm] // TrigReduce
```

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

$$i \sin[2 \pi k_1]$$

```
binom[10]
transferfunktion[binom[10]]
transferfunktion[binom[10]] // TrigReduce
```

$$\left\{ \frac{1}{1024}, \frac{5}{512}, \frac{45}{1024}, \frac{15}{128}, \frac{105}{512}, \frac{63}{256}, \frac{105}{512}, \frac{15}{128}, \frac{45}{1024}, \frac{5}{512}, \frac{1}{1024} \right\}$$

$$\cos[\pi k_1]^{10}$$

$$\frac{1}{512} (126 + 210 \cos[2 \pi k_1] + 120 \cos[4 \pi k_1] + 45 \cos[6 \pi k_1] + 10 \cos[8 \pi k_1] + \cos[10 \pi k_1])$$

1D-Plots von Transferfunktionen :

```
Show[(Print[TableForm@TrigReduce[#[[1]]]]];
      Plot[Evaluate[#[[1]]], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}},
          PlotStyle → Thick, PlotLegends → Placed[(MatrixForm[#] & /@#[[2]]], {{0, 0}, {-0.5, 0.0}})] &[
          Transpose[{transferfunktion[#], MatrixForm[{#]}] & /@ {box[1], box[3], box[5], box[7], box[9], box[11]}}], ImageSize → pagewidth]
```

1

$$\frac{1}{3} (1 + 2 \cos[2 \pi k_1])$$

$$\frac{1}{5} (1 + 2 \cos[2 \pi k_1] + 2 \cos[4 \pi k_1])$$

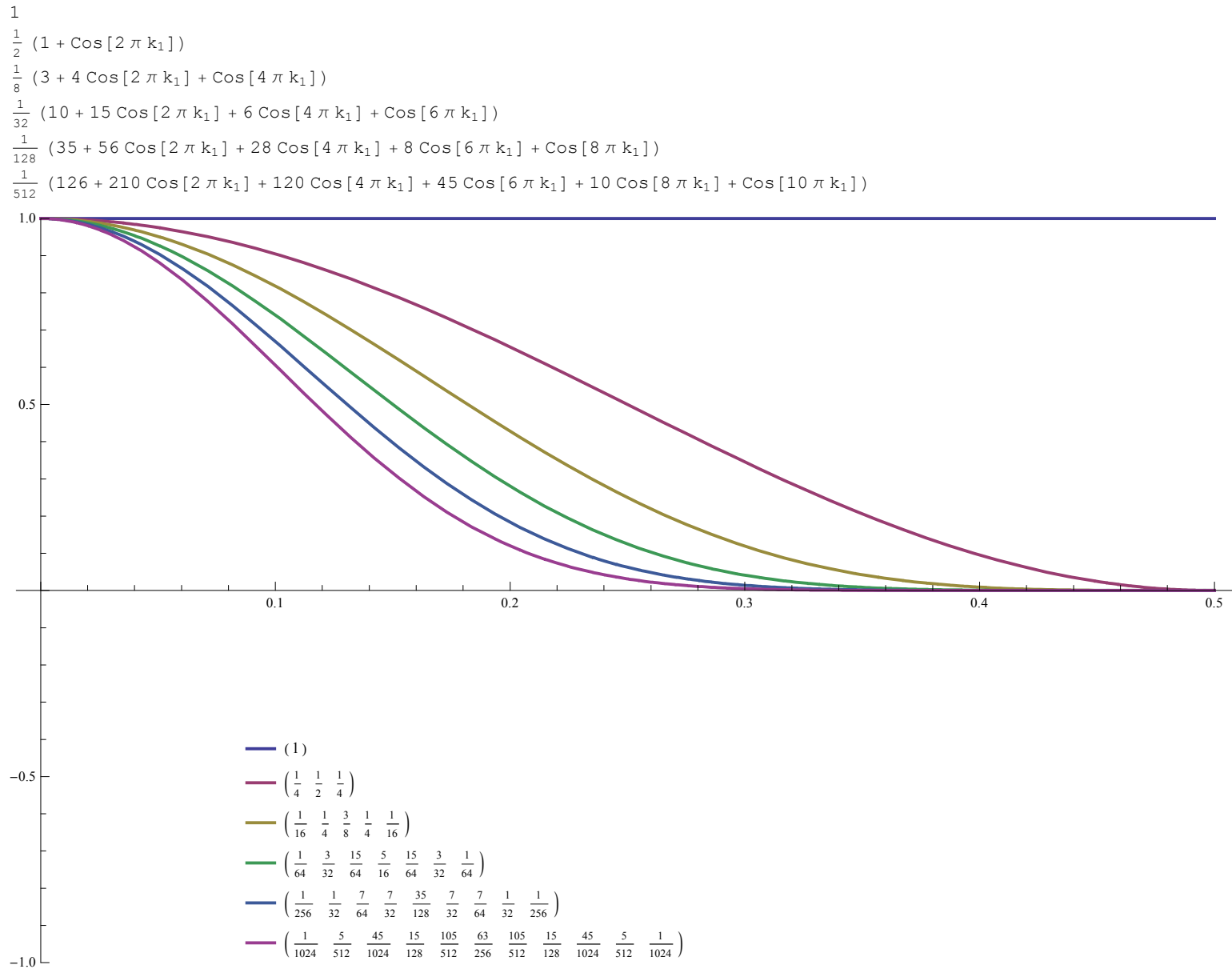
$$\frac{1}{7} (1 + 2 \cos[2 \pi k_1] + 2 \cos[4 \pi k_1] + 2 \cos[6 \pi k_1])$$

$$\frac{1}{9} (1 + 2 \cos[2 \pi k_1] + 2 \cos[4 \pi k_1] + 2 \cos[6 \pi k_1] + 2 \cos[8 \pi k_1])$$

$$\frac{1}{11} (1 + 2 \cos[2 \pi k_1] + 2 \cos[4 \pi k_1] + 2 \cos[6 \pi k_1] + 2 \cos[8 \pi k_1] + 2 \cos[10 \pi k_1])$$



```
Show[ (Print[TableForm@TrigReduce[#[[1]]]];
  Plot[Evaluate[#[[1]]], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}},
  PlotStyle → Thick, PlotLegends → Placed[(MatrixForm[#] & /@#[[2]]], {{0, 0}, {-0.5, 0.0}}]]) &[Transpose[
  {transferfunktion[#], MatrixForm[{#]} & /@ {binom[0], binom[2], binom[4], binom[6], binom[8], binom[10]}}], ImageSize → pagewidth]
```



Beispiele 2D-DFT:

3x3 Boxfilter

```
Transpose[{box[3]}.{box[3]} // MatrixForm
transferfunktion2d[Transpose[{box[3]}.{box[3]}]
```

$$\begin{pmatrix} \frac{1}{9} & \frac{1}{9} & \frac{1}{9} \\ \frac{1}{9} & \frac{1}{9} & \frac{1}{9} \\ \frac{1}{9} & \frac{1}{9} & \frac{1}{9} \end{pmatrix}$$

$$\frac{1}{9} (1 + 2 \cos[2 \pi k_1]) (1 + 2 \cos[2 \pi k_2])$$

3x3 Binomialfilter

```
Transpose[{binom[2]}.{binom[2]} // MatrixForm
transferfunktion2d[Transpose[{binom[2]}.{binom[2]}]
```

$$\begin{pmatrix} \frac{1}{16} & \frac{1}{8} & \frac{1}{16} \\ \frac{1}{8} & \frac{1}{4} & \frac{1}{8} \\ \frac{1}{16} & \frac{1}{8} & \frac{1}{16} \end{pmatrix}$$

$$\cos^2[\pi k_1] \cos^2[\pi k_2]$$

5x5 Binomialfilter

```
Transpose[{binom[4]}] . {binom[4]} // MatrixForm
transferfunktion2d[Transpose[{binom[4]}] . {binom[4]}]
```

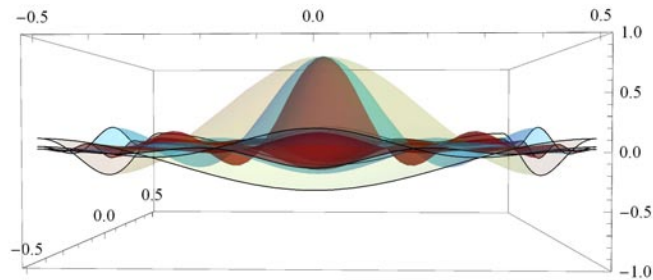
$$\begin{pmatrix} \frac{1}{256} & \frac{1}{64} & \frac{3}{128} & \frac{1}{64} & \frac{1}{256} \\ \frac{1}{64} & \frac{1}{16} & \frac{3}{32} & \frac{1}{16} & \frac{1}{64} \\ \frac{3}{128} & \frac{3}{32} & \frac{9}{64} & \frac{3}{32} & \frac{3}{128} \\ \frac{1}{64} & \frac{1}{16} & \frac{3}{32} & \frac{1}{16} & \frac{1}{64} \\ \frac{1}{256} & \frac{1}{64} & \frac{3}{128} & \frac{1}{64} & \frac{1}{256} \end{pmatrix}$$

$$\cos[\pi k_1]^4 \cos[\pi k_2]^4$$

2D-Plots von Transferfunktionen :

Boxfilter

```
Plot3D[Evaluate[{transferfunktion2d[Transpose[{box[3]}] . {box[3]}],
  transferfunktion2d[Transpose[{box[5]}] . {box[5]}], transferfunktion2d[Transpose[{box[7]}] . {box[7]}]}], {k1, -kmax, kmax},
{k2, -kmax, kmax}, PlotStyle -> {Directive[Yellow, Opacity[.125]], Directive[Cyan, Opacity[.25]], Directive[Red, Opacity[.5]]},
PlotLegends -> Placed["Expressions", {Left, Bottom}], Mesh -> None, PlotRange -> {Full, Full, {-1, 1}}, ViewPoint -> Front]
```



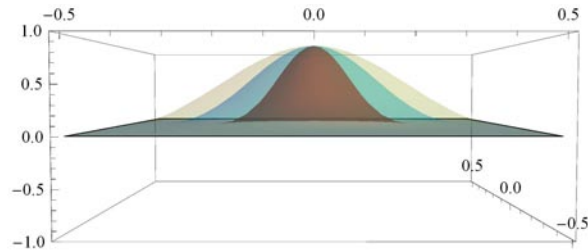
$$\frac{1}{9} (1 + 2 \cos(2 \pi k_1)) (1 + 2 \cos(2 \pi k_2))$$

$$\frac{1}{25} (1 + 2 \cos(2 \pi k_1) + 2 \cos(4 \pi k_1)) (1 + 2 \cos(2 \pi k_2) + 2 \cos(4 \pi k_2))$$

$$\frac{1}{49} (1 + 2 \cos(2 \pi k_1) + 2 \cos(4 \pi k_1) + 2 \cos(6 \pi k_1)) (1 + 2 \cos(2 \pi k_2) + 2 \cos(4 \pi k_2) + 2 \cos(6 \pi k_2))$$

Binomialfilter

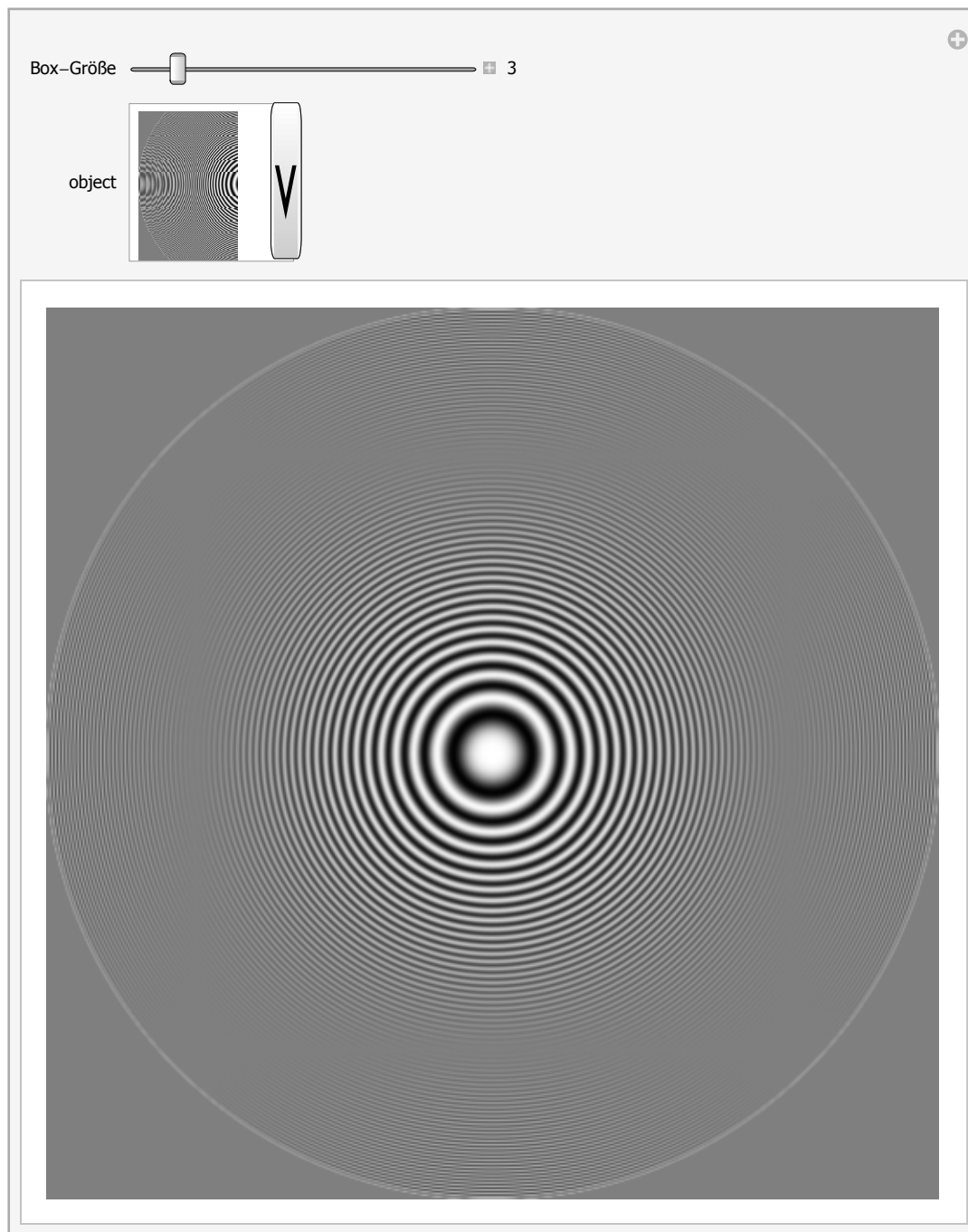
```
Plot3D[Evaluate[{transferfunktion2d[Transpose[{binom[2]}].{binom[2]}], transferfunktion2d[Transpose[{binom[4]}].{binom[4]}],
  transferfunktion2d[Transpose[{binom[12]}].{binom[12]}]}], {k1, -kmax, kmax}, {k2, -kmax, kmax},
PlotStyle → {Directive[Yellow, Opacity[.125]], Directive[Cyan, Opacity[.25]], Directive[Red, Opacity[.5]]},
PlotLegends → Placed["Expressions", {Left, Bottom}], Mesh → None, PlotRange → {Full, Full, {-1, 1}}, ViewPoint → Front]
```



- $\cos^2(\pi k_1) \cos^2(\pi k_2)$
- $\cos^4(\pi k_1) \cos^4(\pi k_2)$
- $\cos^{12}(\pi k_1) \cos^{12}(\pi k_2)$

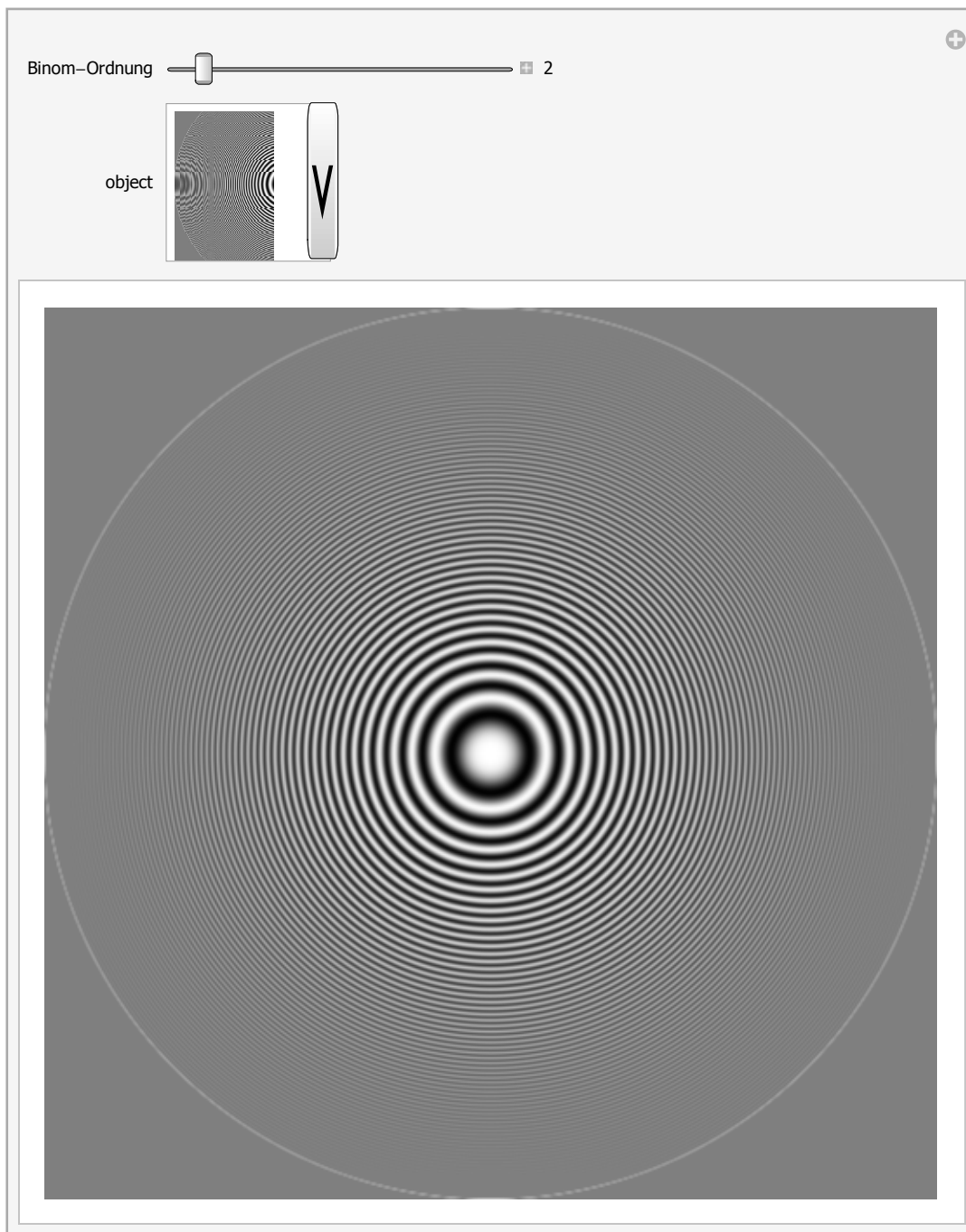
Interaktive Demo des Boxfilters

```
Manipulate[Show[Image[ListConvolve[Transpose[{box[größe]}].{box[größe]}], ImageData@bild, (größe + 1) / 2]],
  ImageSize → ImageDimensions@bild], {{größe, 3, "Box-Größe"}, 1, 21, 2, Appearance → "Labeled"},
{{bild, wellenbild, "object"}, {wellenbild, First@ColorSeparate[Ton3CD21dreikanalausgleichF2], mandrill, phantomhead, turtle, lenay,
  pollen, randombild, rauschbild, ocelot}}, ImageSize → Tiny, ControlType → PopupMenu, ContinuousAction → False, SaveDefinitions → True]
```



Interaktive Demo des Tiefpaßfilter (Binomialfilters)

```
Manipulate[Show[Image[ListConvolve[Transpose[{binom[ordnung]}].{binom[ordnung]}, ImageData@bild, ordnung / 2 + 1]],
  ImageSize → ImageDimensions@bild], {{ordnung, 2, "Binom-Ordnung"}, 0, 30, 2, Appearance → "Labeled"},
{{bild, wellenbild, "object"}, {wellenbild, First@ColorSeparate[Ton3CD21dreikanalausgleichF2], mandrill, phantomhead, turtle, lenay,
  pollen, randombild, rauschbild, ocelot}, ImageSize → Tiny, ControlType → PopupMenu}, ContinuousAction → False, SaveDefinitions → True]
```



13. Weitere Einsatzfelder linearer diskrete verschiebungsinvariante Filter

Bandpaß als Linearkombination von Filtern, zum Beispiel als Differenz von Binomialfiltern 2. und 4. Ordnung

```
Clear[plottransferfunktion];
plottransferfunktion[formel_] := Module[{},
  GraphicsGrid[{{
    Plot[Evaluate[ComplexExpand[Re[formel]]], {k1, 0, kmax},
      AxesLabel -> {k1, None}, PlotRange -> {Full, {-1, 1}}, PlotLabel -> "Realteil", PlotPoints -> r},
    Plot[Evaluate[ComplexExpand[Im[formel]]], {k1, 0, kmax},
      AxesLabel -> {k1, None}, PlotRange -> {Full, {-1, 1}}, PlotLabel -> "Imaginärteil", PlotPoints -> r},
    Plot[Evaluate[ArcTan[ComplexExpand[Im[formel] / (ComplexExpand[Re[formel]] + $MachineEpsilon)]]],
      {k1, 0, kmax}, AxesLabel -> {k1, None}, PlotRange -> {Full, {- $\pi$  / 2,  $\pi$  / 2}}, PlotLabel -> "Phasenwinkel",
      PlotPoints -> r, Ticks -> {Automatic, (Range[#] - (# + 1) / 2) / ((# - 1) / 2) / 2 *  $\pi$  &[5]}}
  ]];
```



```

Clear[plottransferfunktion2d];
plottransferfunktion2d[formel_] := Module[{},
  GraphicsGrid[{{

    Plot3D[Evaluate[ComplexExpand[Re[formel]]], {k1, -kmax, kmax}, {k2, -kmax, kmax},
      AxesLabel -> {k1, k2, None}, PlotRange -> {Full, Full, {-1, 1}}, PlotLabel -> "Realteil", Mesh -> 19, RotationAction -> "Clip",

    Plot3D[Evaluate[ComplexExpand[Im[formel]]], {k1, -kmax, kmax}, {k2, -kmax, kmax}, AxesLabel -> {k1, k2, None},
      PlotRange -> {Full, Full, {-1, 1}}, PlotLabel -> "Imaginärteil", Mesh -> 19, RotationAction -> "Clip",

    Plot3D[Evaluate[ArcTan[ComplexExpand[Im[formel] / (ComplexExpand[Re[formel]] + $MachineEpsilon)]]], {k1, -kmax, kmax},
      {k2, -kmax, kmax}, AxesLabel -> {k1, k2, None}, PlotRange -> {Full, Full, {-π/2, π/2}}, PlotLabel -> "Phasenwinkel",
      Ticks -> {Automatic, Automatic, (Range[#] - (# + 1) / 2) / ((# - 1) / 2) / 2 * π &[3]}, Mesh -> 19, RotationAction -> "Clip"]

  ]}]
];

Show[(Print[TableForm@TrigReduce[#[[1]]]]];
  Plot[Evaluate[#[[1]]], {k1, 0, kmax}, AxesLabel -> {k1, None},
    PlotRange -> {Full, {-1, 1}}, PlotStyle -> Thick, PlotLegend -> (MatrixForm[#] & /@ #[[2]]), LegendShadow -> None,
    LegendPosition -> {-0.75, -0.75}, LegendSize -> {1.5, .5}, LegendOrientation -> Vertical] &[
  Transpose[{transferfunktion[#], MatrixForm[{#]}] & /@ {ListConvolve[binom[2], identität[5], 2], binom[4],
    ListConvolve[binom[2], identität[5], 2] - binom[4], (ListConvolve[binom[2], identität[5], 2] - binom[4]) /
    First[Maximize[{(transferfunktion[binom[2]] - transferfunktion[binom[4]]), 0 ≤ k1 ≤ 1/2}, k1]]}], ImageSize -> 800]

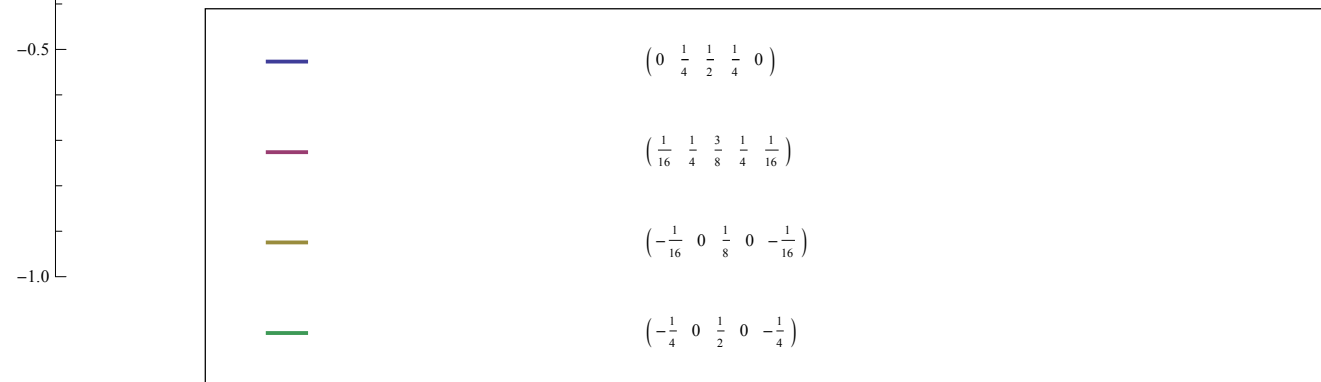
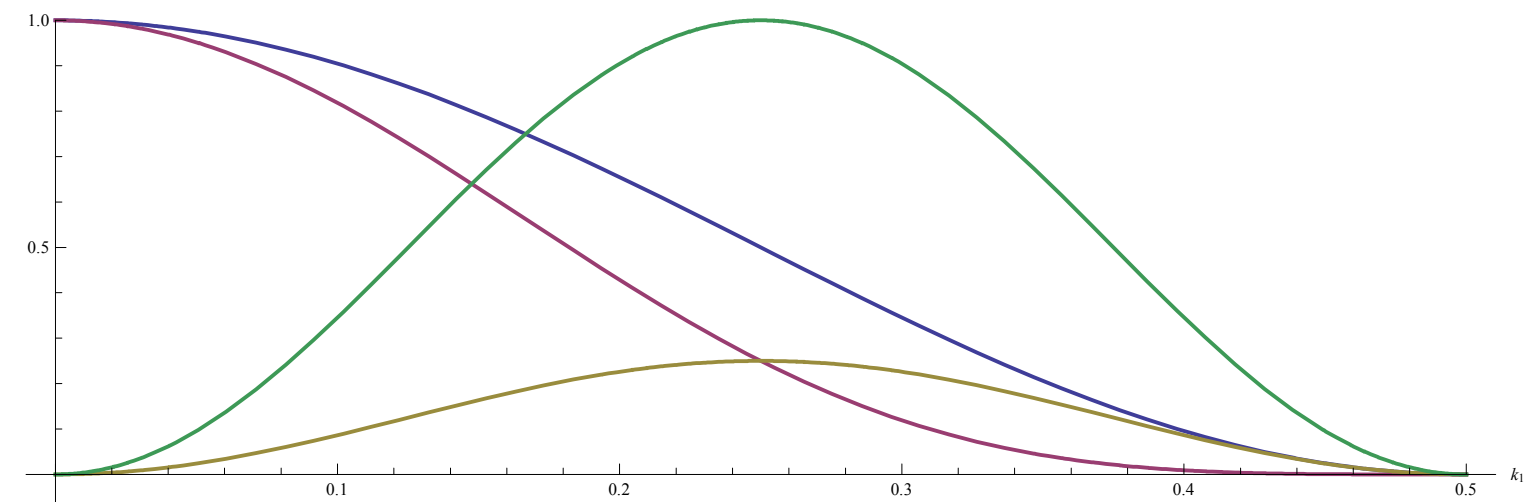

$$\frac{1}{2} (1 + \cos[2 \pi k_1])$$


$$\frac{1}{8} (3 + 4 \cos[2 \pi k_1] + \cos[4 \pi k_1])$$


$$\frac{1}{8} (1 - \cos[4 \pi k_1])$$


$$\frac{1}{2} (1 - \cos[4 \pi k_1])$$


```



`transferfunktion[binom[2]] - transferfunktion[binom[4]]`

$\cos[\pi k_1]^2 - \cos[\pi k_1]^4$

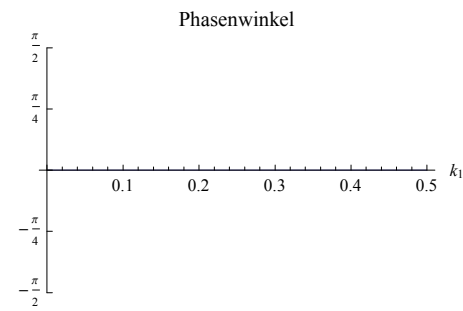
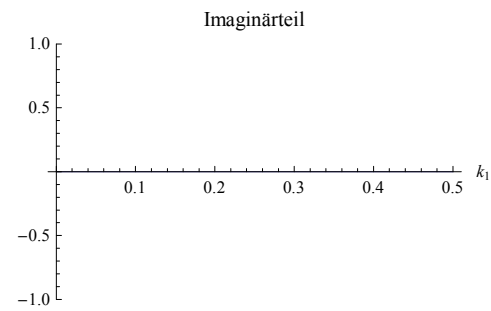
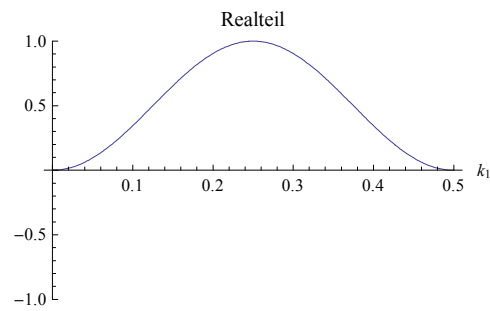
`Maximize[{(transferfunktion[binom[2]] - transferfunktion[binom[4]]), 0 ≤ k1 ≤ 1 / 2}, k1]`

$\left\{ \frac{1}{4}, \left\{ k_1 \rightarrow \frac{1}{4} \right\} \right\}$

```
(transferfunktion[binom[2]] - transferfunktion[binom[4]]) /
First[Maximize[{(transferfunktion[binom[2]] - transferfunktion[binom[4]]), 0 ≤ k1 ≤ 1 / 2}, k1]]
4 (Cos[π k1]2 - Cos[π k1]4)
```

Viele Filter weisen keinerlei Phasenversatz auf, da gerade (wie zum Beispiel der eben betrachtete Bandpaß):

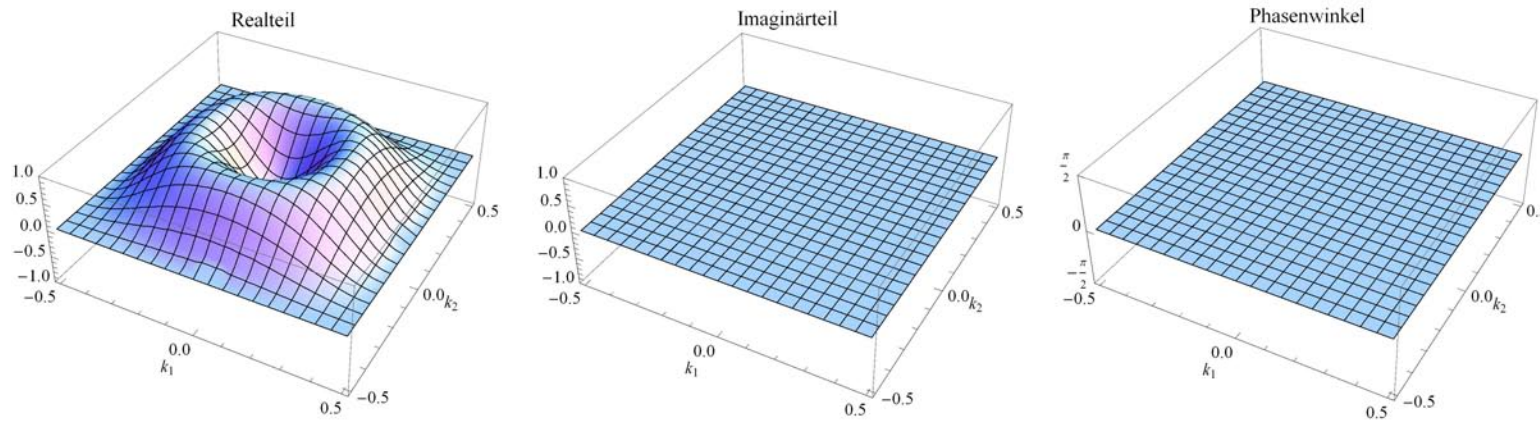
```
4 (transferfunktion[binom[2]] - transferfunktion[binom[4]])
Show[plottransferfunktion[4 (transferfunktion[binom[2]] - transferfunktion[binom[4]])], ImageSize → pagewidth]
4 (Cos[π k1]2 - Cos[π k1]4)
```



```

4 (transferfunktion2d[Transpose[{binom[2]}].{binom[2]}] - transferfunktion2d[Transpose[{binom[4]}].{binom[4]}])
Show[plottransferfunktion2d[
  4 (transferfunktion2d[Transpose[{binom[2]}].{binom[2]}] - transferfunktion2d[Transpose[{binom[4]}].{binom[4]}]), ImageSize -> pagewidth]
4 (Cos[ $\pi k_1$ ]2 Cos[ $\pi k_2$ ]2 - Cos[ $\pi k_1$ ]4 Cos[ $\pi k_2$ ]4)

```



Das Superpositionsprinzip gilt (man muß nicht die Summe der Transferfunktionen betrachten, man kann auch die Transferfunktion der Summe nehmen):

```

ListConvolve[Transpose[{binom[2]}].{binom[2]}, Transpose[{identität[5]}].{identität[5]}, {{2, 2}}]

```

```

{ {0, 0, 0, 0, 0}, {0, 1/16, 1/8, 1/16, 0}, {0, 1/8, 1/4, 1/8, 0}, {0, 1/16, 1/8, 1/16, 0}, {0, 0, 0, 0, 0} }

```

```

bandpaßkern = 4 *

```

```

(ListConvolve[Transpose[{binom[2]}].{binom[2]}, Transpose[{identität[5]}].{identität[5]}, {{2, 2}}] - Transpose[{binom[4]}].{binom[4]}]);

```

bandpaßkern // MatrixForm

$$\begin{pmatrix} -\frac{1}{64} & -\frac{1}{16} & -\frac{3}{32} & -\frac{1}{16} & -\frac{1}{64} \\ -\frac{1}{16} & 0 & \frac{1}{8} & 0 & -\frac{1}{16} \\ -\frac{3}{32} & \frac{1}{8} & \frac{7}{16} & \frac{1}{8} & -\frac{3}{32} \\ -\frac{1}{16} & 0 & \frac{1}{8} & 0 & -\frac{1}{16} \\ -\frac{1}{64} & -\frac{1}{16} & -\frac{3}{32} & -\frac{1}{16} & -\frac{1}{64} \end{pmatrix}$$

MatrixRank[bandpaßkern]

2

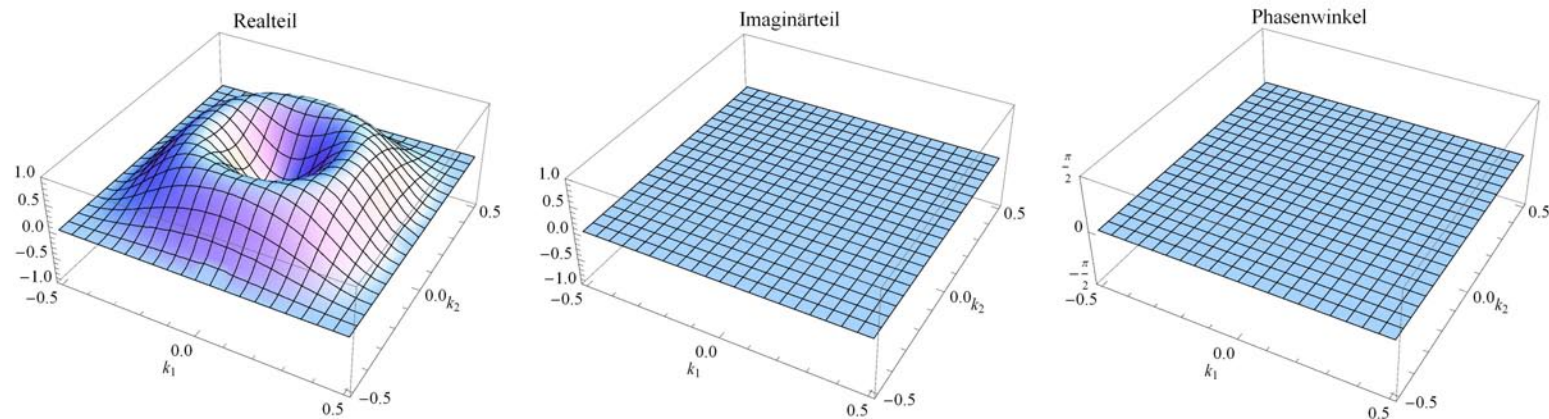
MatrixRank[Transpose[{binom[4]}] . {binom[4]}]

1

transferfunktion2d[bandpaßkern]

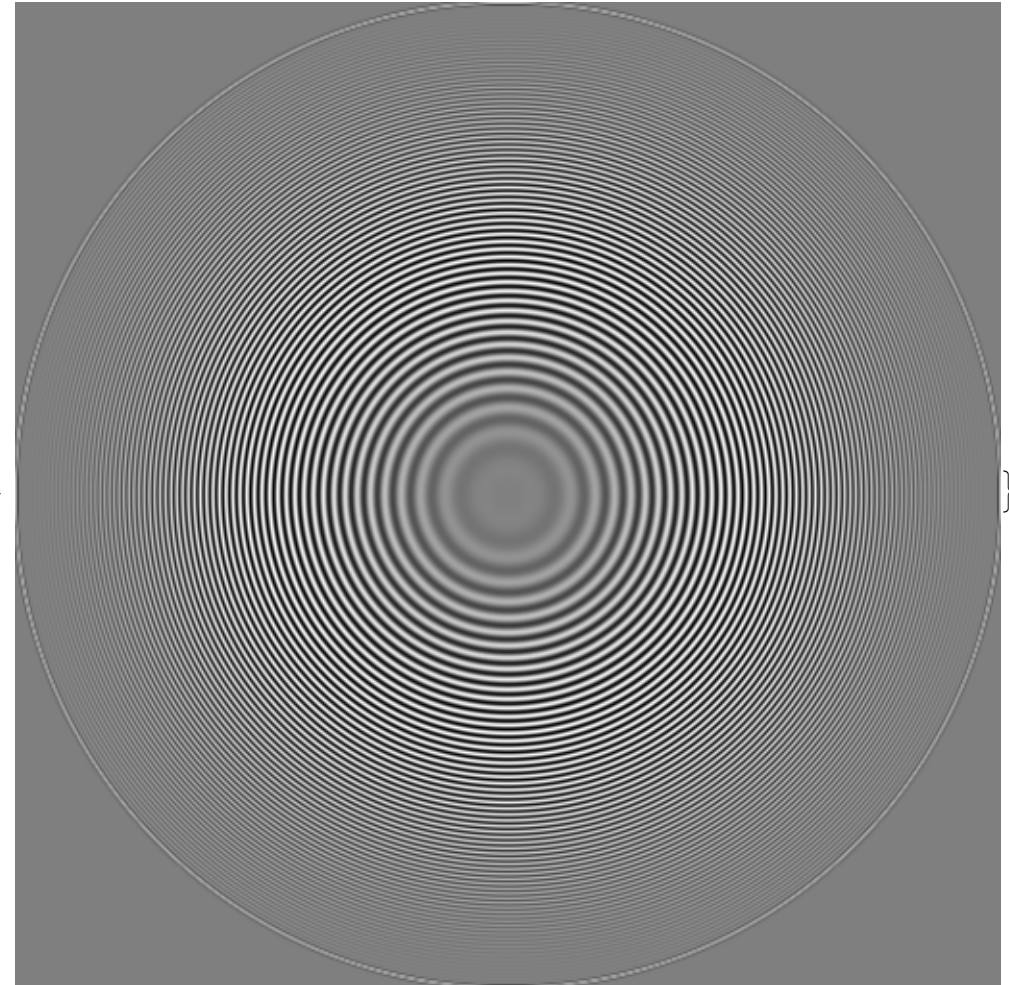
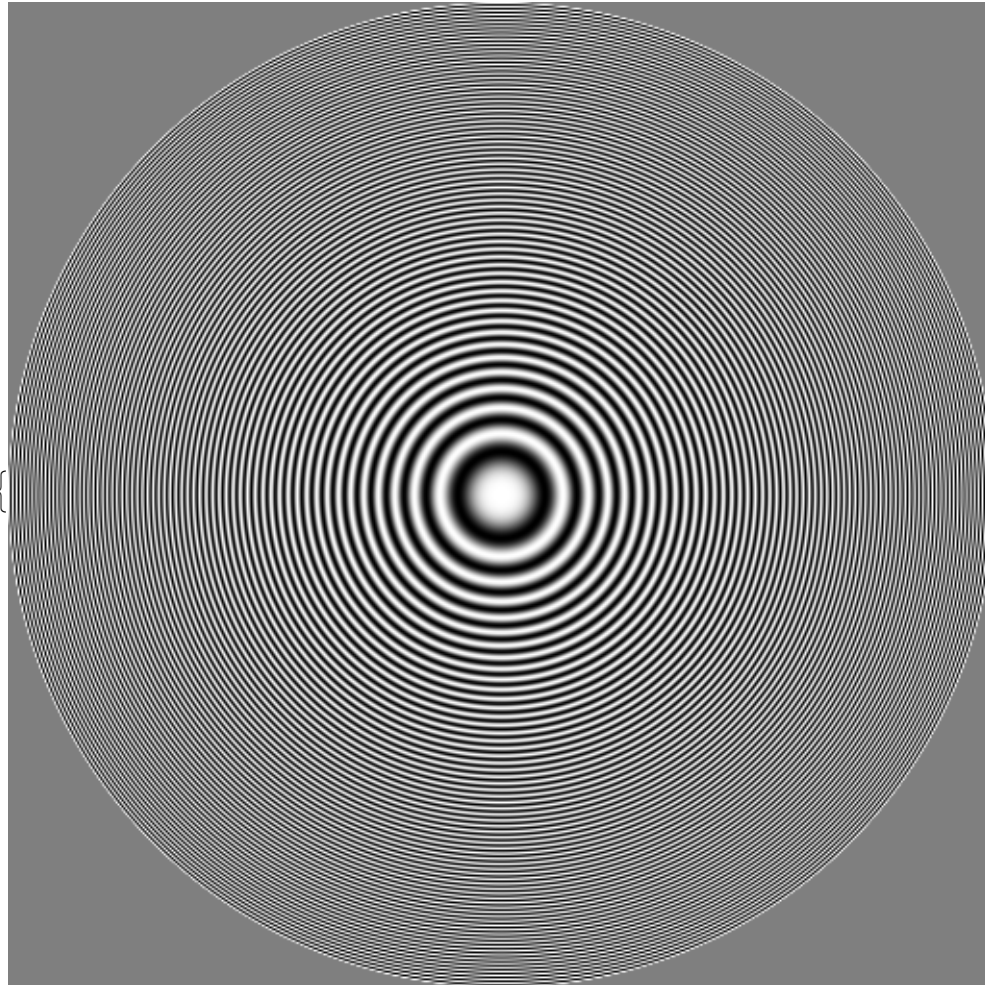
Show[plottransferfunktion2d[transferfunktion2d[bandpaßkern]], ImageSize → pagewidth]

$$-\frac{1}{2} \cos[\pi k_1]^2 \cos[\pi k_2]^2 (-6 + 2 \cos[2 \pi k_1] + \cos[2 \pi (k_1 - k_2)] + 2 \cos[2 \pi k_2] + \cos[2 \pi (k_1 + k_2)])$$

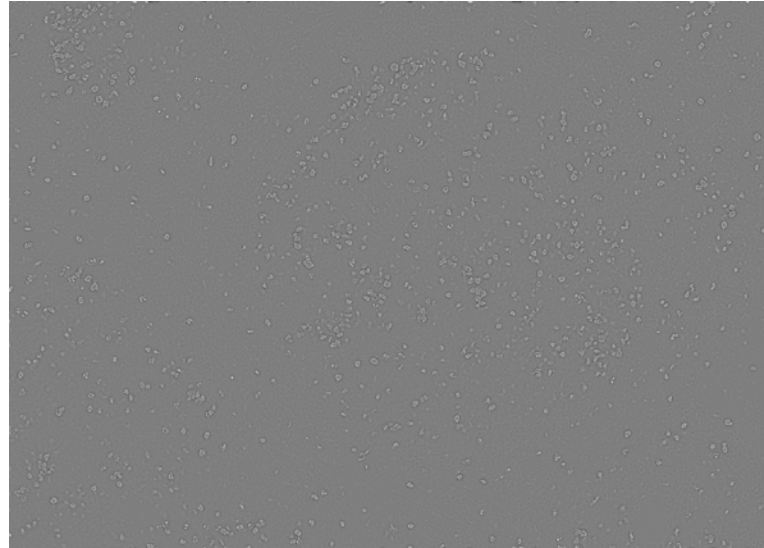
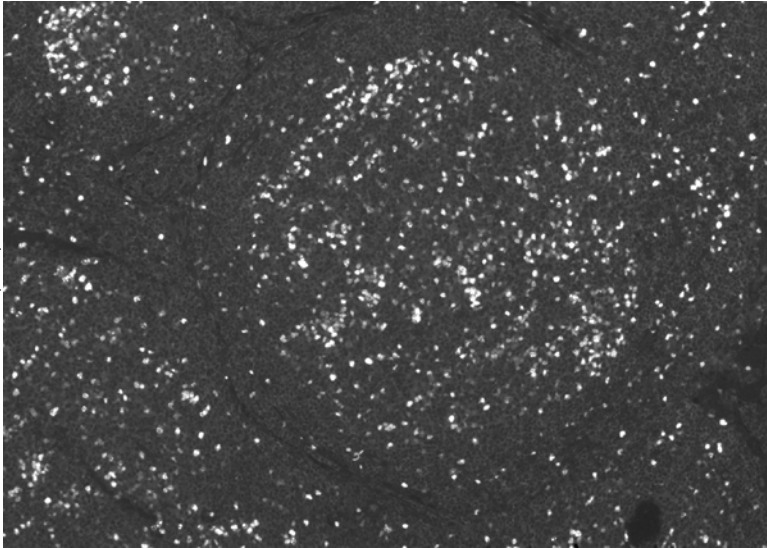


```
FullSimplify[TrigToExp[transferfunktion2d[bandpaßkern]]] ==
FullSimplify[TrigToExp[4 (transferfunktion2d[Transpose[{binom[2]}] . {binom[2]}] - transferfunktion2d[Transpose[{binom[4]}] . {binom[4]}])]]]
True

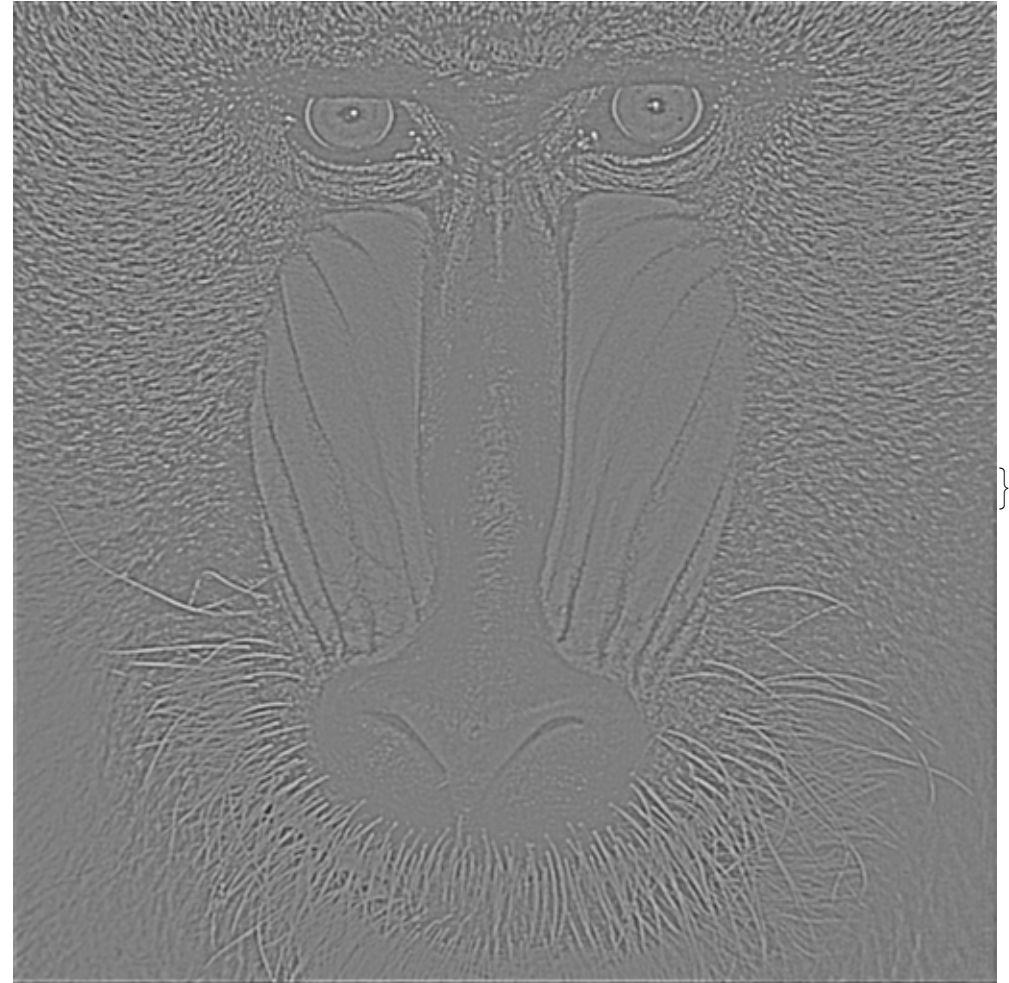
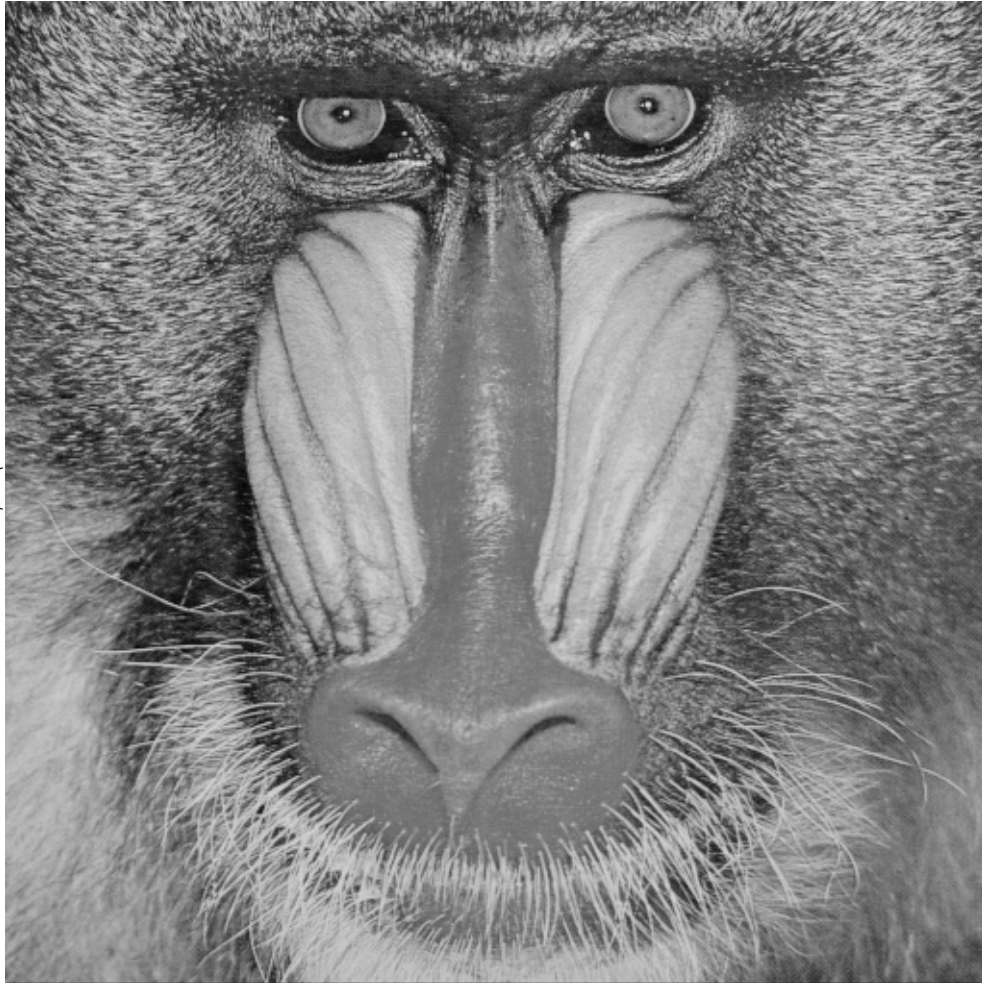
{Show[Image[#2]], Show[Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]]]} &[bandpaßkern, ImageData[wellenbild]]
```




```
Show[#, ImageSize -> pagewidth / 2] & /@ ({Image@#2, Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]]} &[  
  bandpaßkern, ImageData@First@ColorSeparate@Lym3CD21dreikanalausgleichF2])
```



```
{Show[Image[#2]], Show[Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]]]} &[  
bandpaßkern, ImageData[ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Mandrill"}]]]]
```



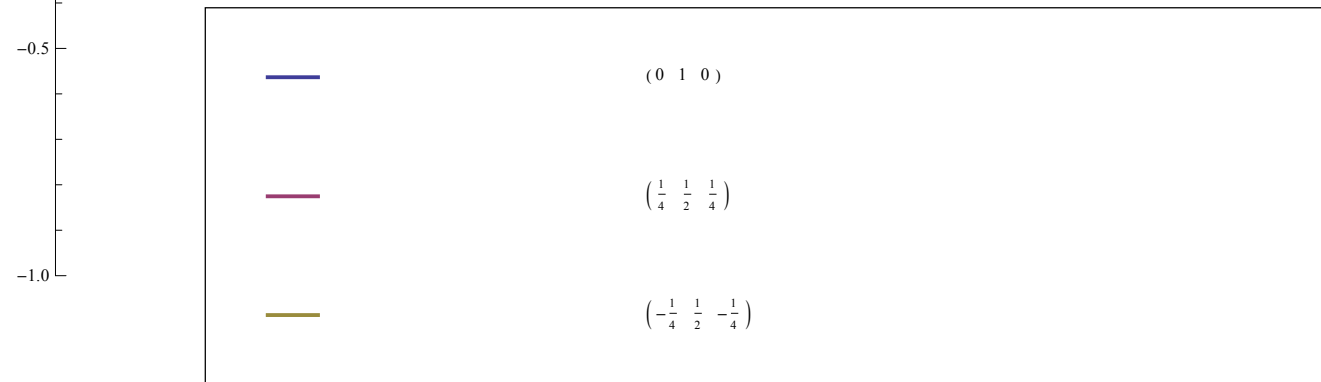
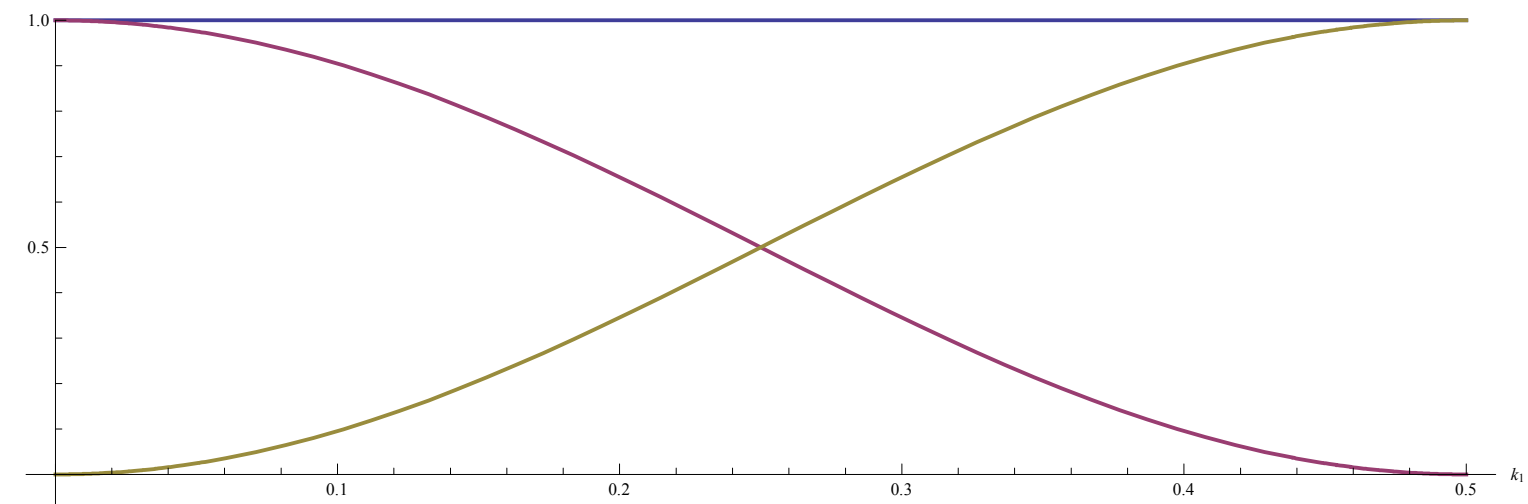
Hochpaß als Linearkombination von Filtern, zum Beispiel als Differenz von Identitätsoperator und Binomialfilter 4. Ordnung

```
Show[(Print[TableForm@TrigReduce#[[1]]]; Plot[Evaluate#[[1]], {k1, 0, kmax},
  AxesLabel -> {k1, None}, PlotRange -> {Full, {-1, 1}}, PlotStyle -> Thick, PlotLegend -> (MatrixForm[#] & /@#[[2]]),
  LegendShadow -> None, LegendPosition -> {-0.75, -0.75}, LegendSize -> {1.5, .5}, LegendOrientation -> Vertical)] &[
  Transpose[{transferfunktion[#], MatrixForm[{#]}] & /@ {identität[3], binom[2], identität[3] - binom[2]}], ImageSize -> 800]
```

$$1$$

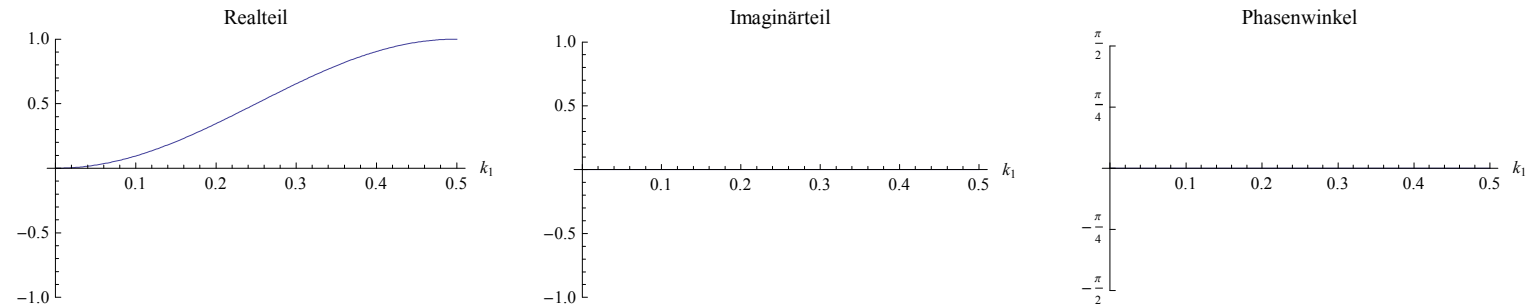
$$\frac{1}{2} (1 + \cos[2 \pi k_1])$$

$$\frac{1}{2} (1 - \cos[2 \pi k_1])$$



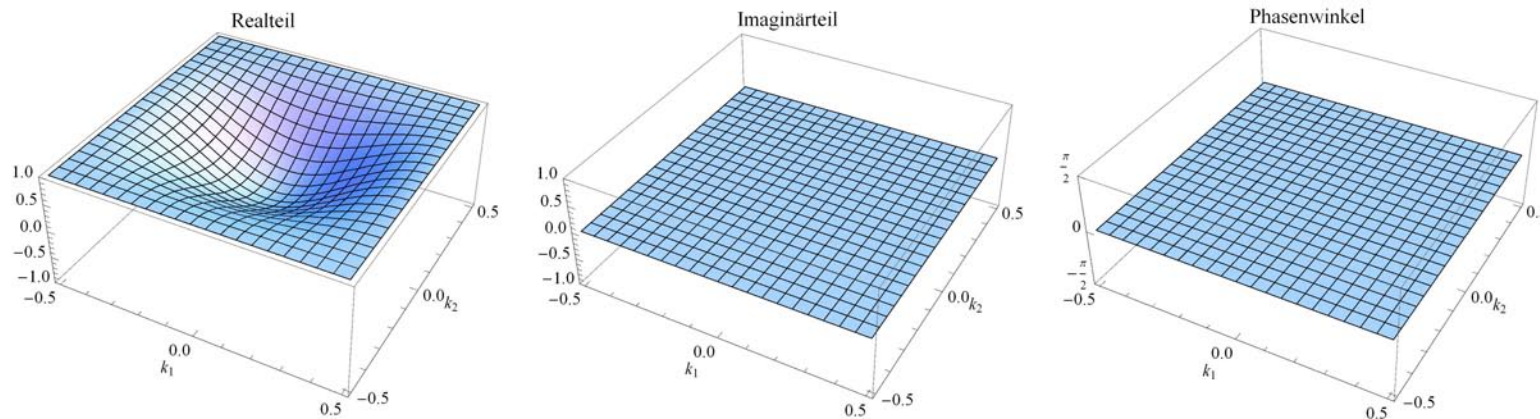
```
transferfunktion[identität[3]] - transferfunktion[binom[2]]
Show[plottransferfunktion[transferfunktion[identität[3]] - transferfunktion[binom[2]]], ImageSize -> pagewidth]
```

$$1 - \cos[\pi k_1]^2$$



```
transferfunktion2d[Transpose[{identität[3]}].{identität[3]}] - transferfunktion2d[Transpose[{binom[2]}].{binom[2]}]
Show[plottransferfunktion2d[transferfunktion2d[Transpose[{identität[3]}].{identität[3]}] -
  transferfunktion2d[Transpose[{binom[2]}].{binom[2]}]], ImageSize -> pagewidth]
```

$$1 - \cos[\pi k_1]^2 \cos[\pi k_2]^2$$



Das Superpositionsprinzip gilt weiterhin:

```
hochpaßkern = Transpose[{identität[3]}].{identität[3]} - Transpose[{binom[2]}].{binom[2]};
```

hochpaßkern // MatrixForm

$$\begin{pmatrix} -\frac{1}{16} & -\frac{1}{8} & -\frac{1}{16} \\ -\frac{1}{8} & \frac{3}{4} & -\frac{1}{8} \\ -\frac{1}{16} & -\frac{1}{8} & -\frac{1}{16} \end{pmatrix}$$

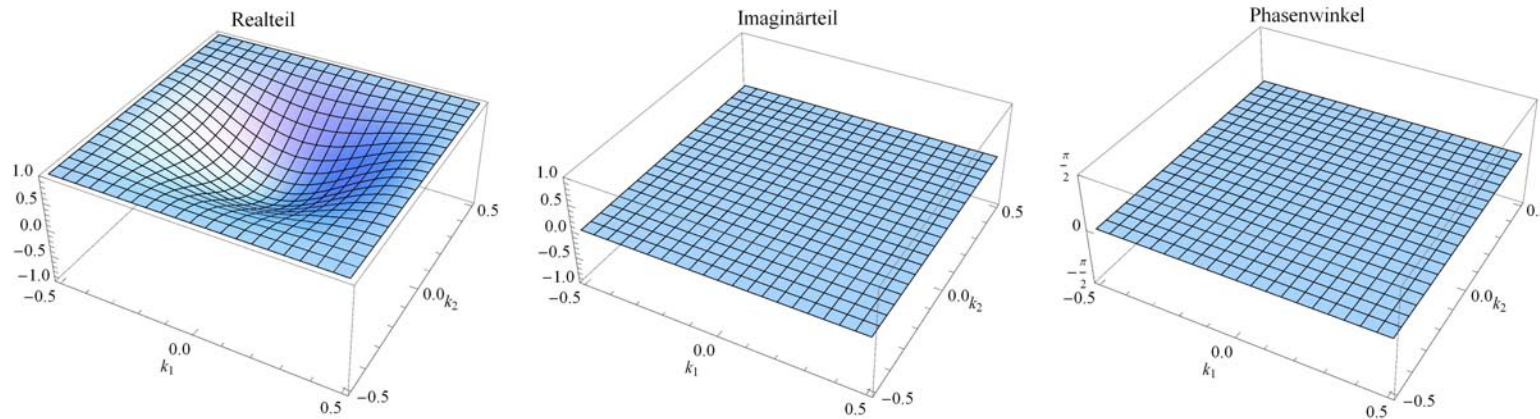
MatrixRank[hochpaßkern]

2

transferfunktion2d[hochpaßkern]

Show[plottransferfunktion2d[transferfunktion2d[hochpaßkern]], ImageSize → pagewidth]

$$\frac{1}{8} (6 - 2 \cos[2 \pi k_1] - \cos[2 \pi (k_1 - k_2)] - 2 \cos[2 \pi k_2] - \cos[2 \pi (k_1 + k_2)])$$



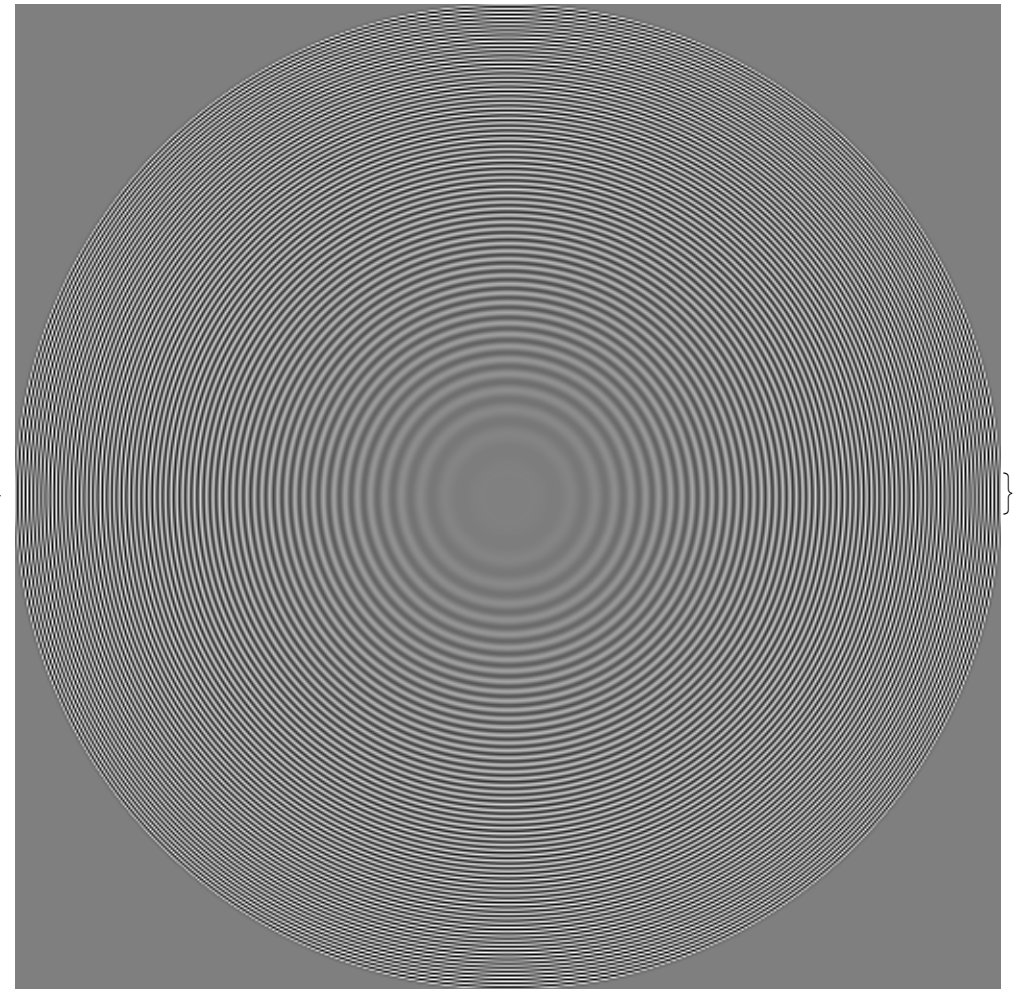
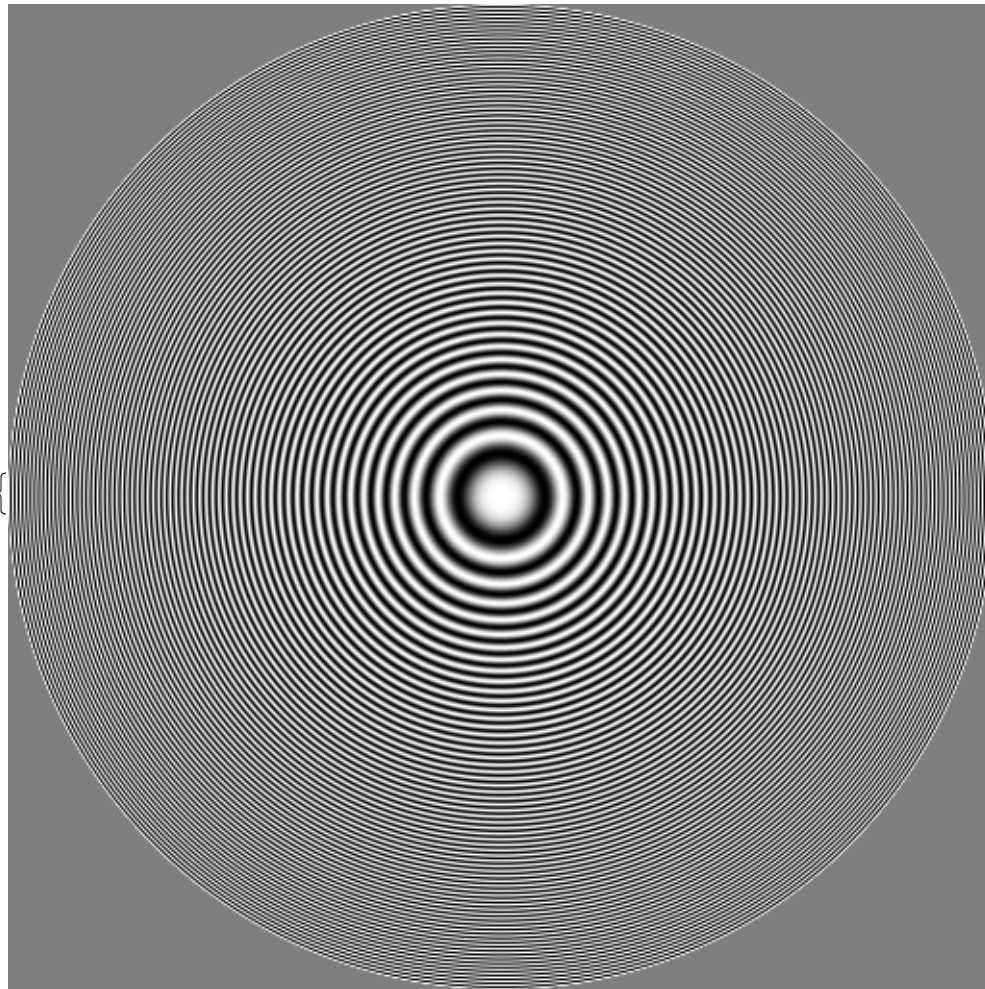
FullSimplify[

TrigReduce[transferfunktion2d[Transpose[{identität[3]}].{identität[3]}] - transferfunktion2d[Transpose[{binom[2]}].{binom[2]}]]] ==

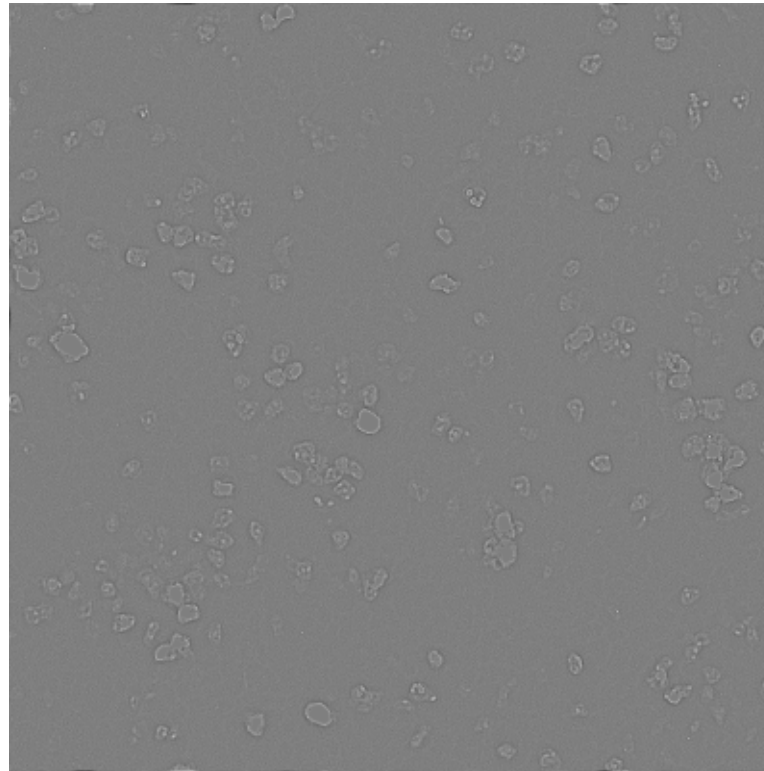
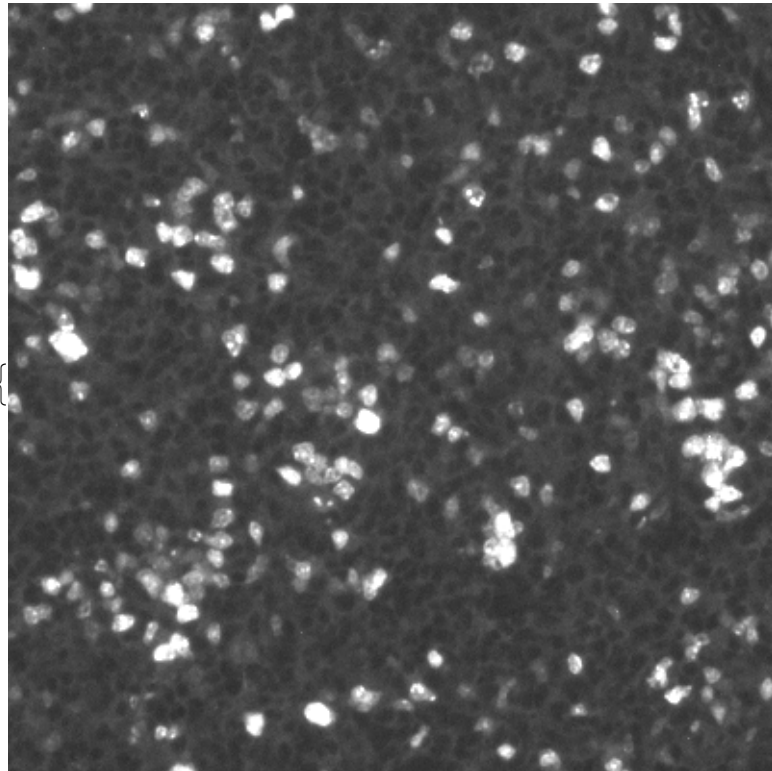
FullSimplify[TrigReduce[transferfunktion2d[hochpaßkern]]]

True

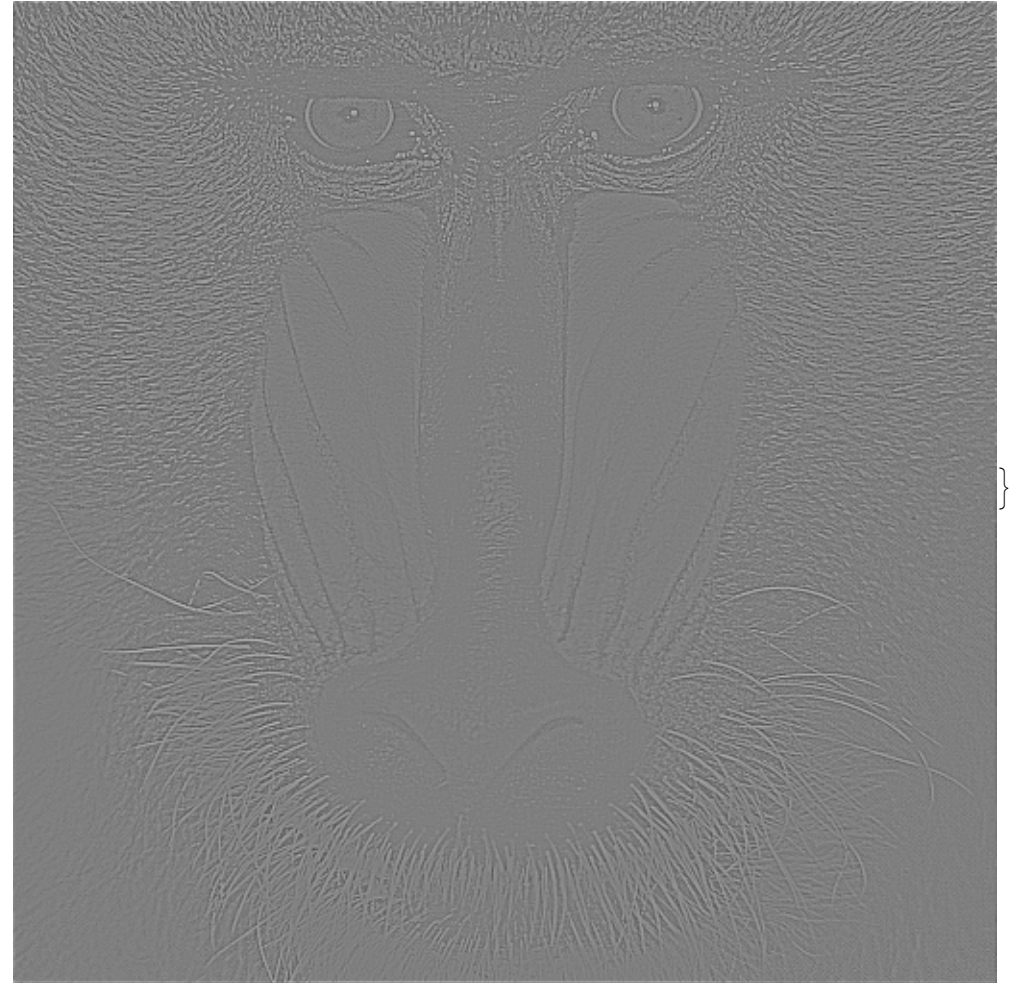
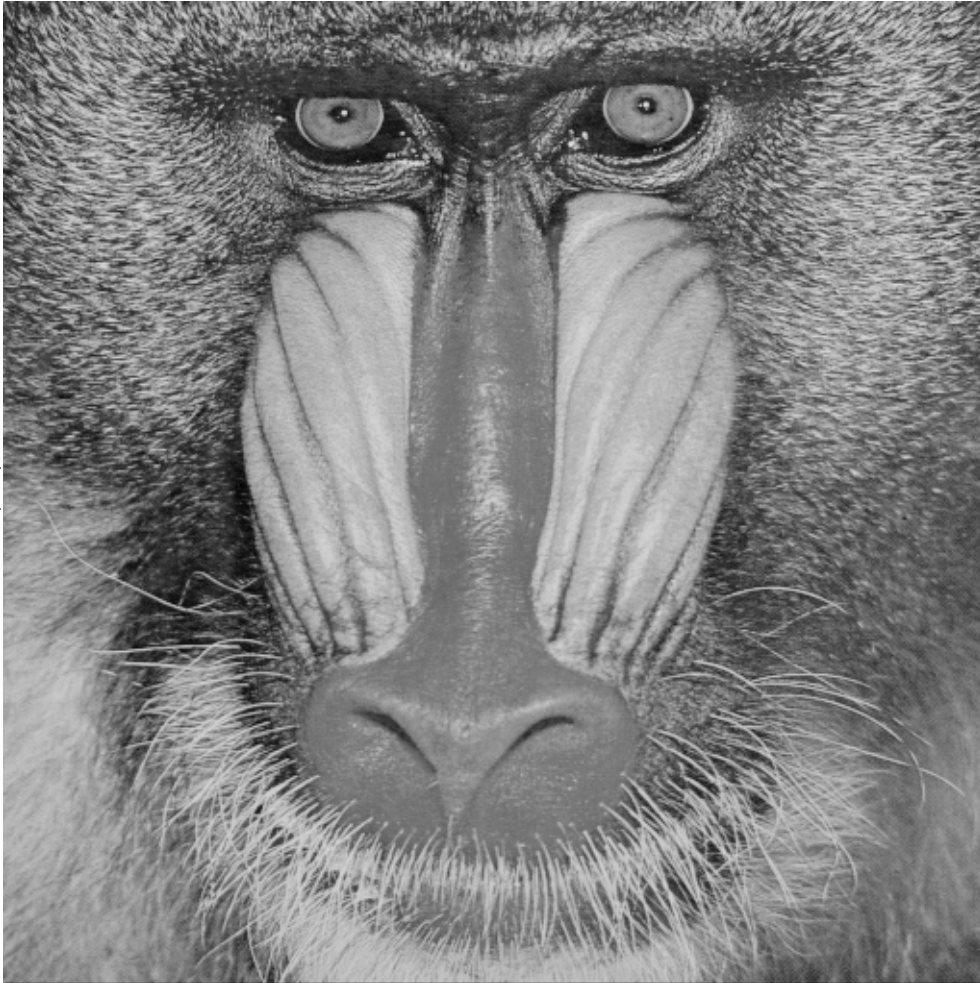

```
{Show[Image[#2]], Show[Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]]]} &[hochpaßkern, ImageData[wellenbild]]
```



```
Show[#, ImageSize -> pagewidth / 2] & /@ ({Image@#2, Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]]} &[
hochpaßkern, ImageData@ImageCrop[First@ColorSeparate@Lym3CD21dreikanalausgleichF2, {pagewidth / 2, pagewidth / 2}]])
```



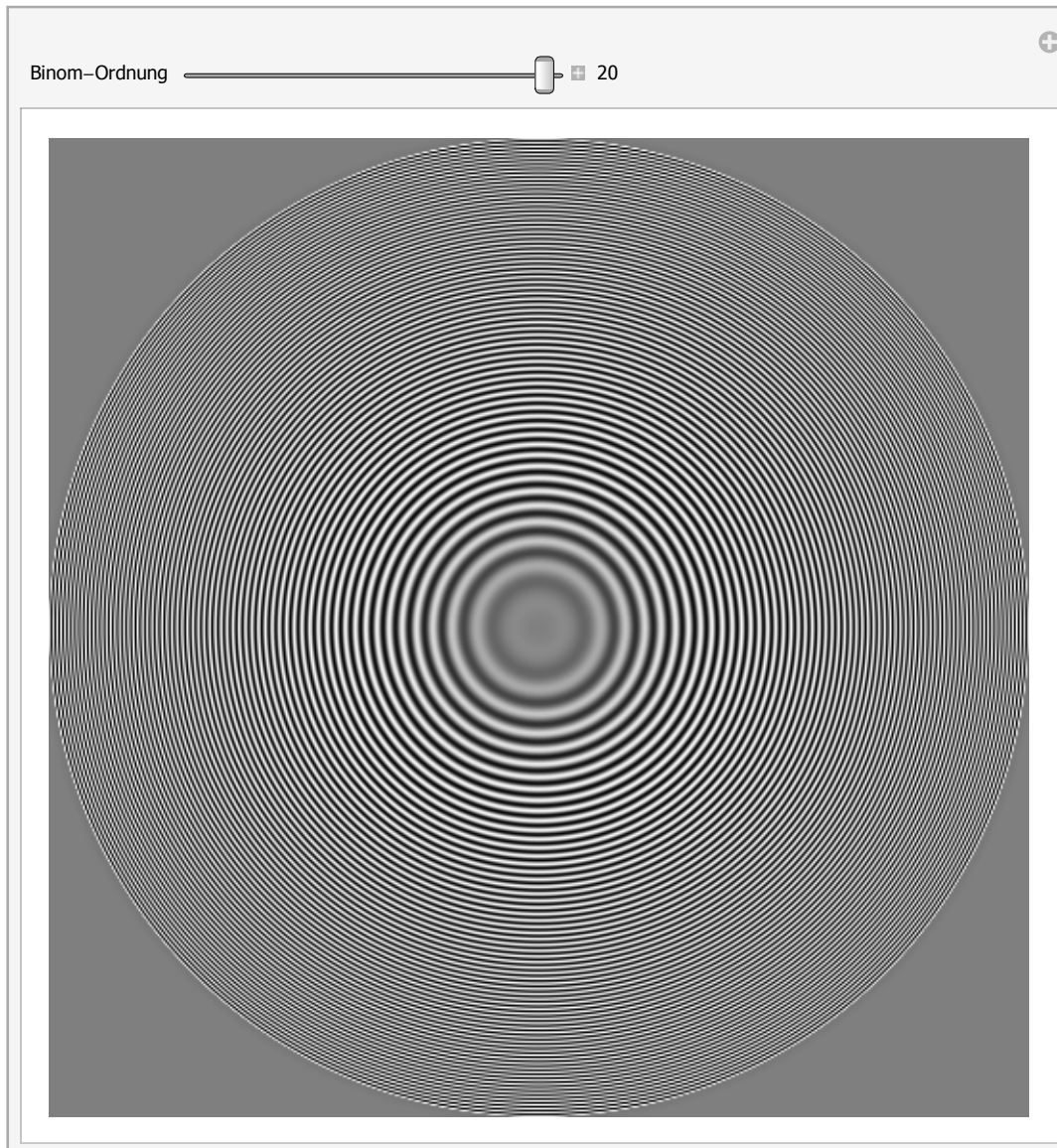
```
{Show[Image[#2]], Show[Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]]]} &[hochpaßkern, ImageData[ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Mandrill"}]]]]
```



```

Manipulate[
  Show[Image[1 / 2 + ListConvolve[Transpose[{identität[ordnung + 1]}] . {identität[ordnung + 1]} - Transpose[{binom[ordnung]}] . {binom[ordnung]}],
    ImageData@wellenbild, ordnung / 2 + 1]], ImageSize → 2 * r + 1],
  {{ordnung, 2, "Binom-Ordnung"}, 0, 20, 2, Appearance → "Labeled"}, SaveDefinitions → True]

```



Approximation von Ableitungsoperatoren 1. Ordnung durch lineare Filter

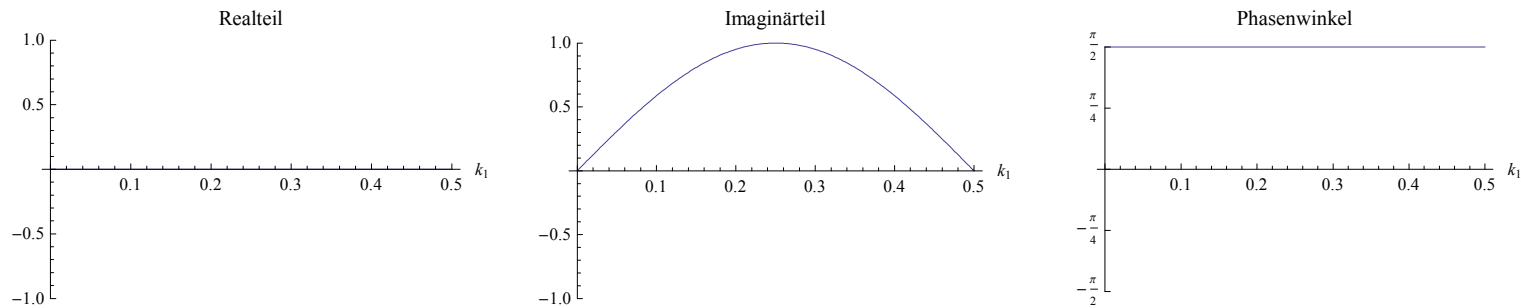
`ableitungsymm`

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

`transferfunktion[ableitungsymm]`

`Show[plottransferfunktion[transferfunktion[ableitungsymm]], ImageSize -> 800]`

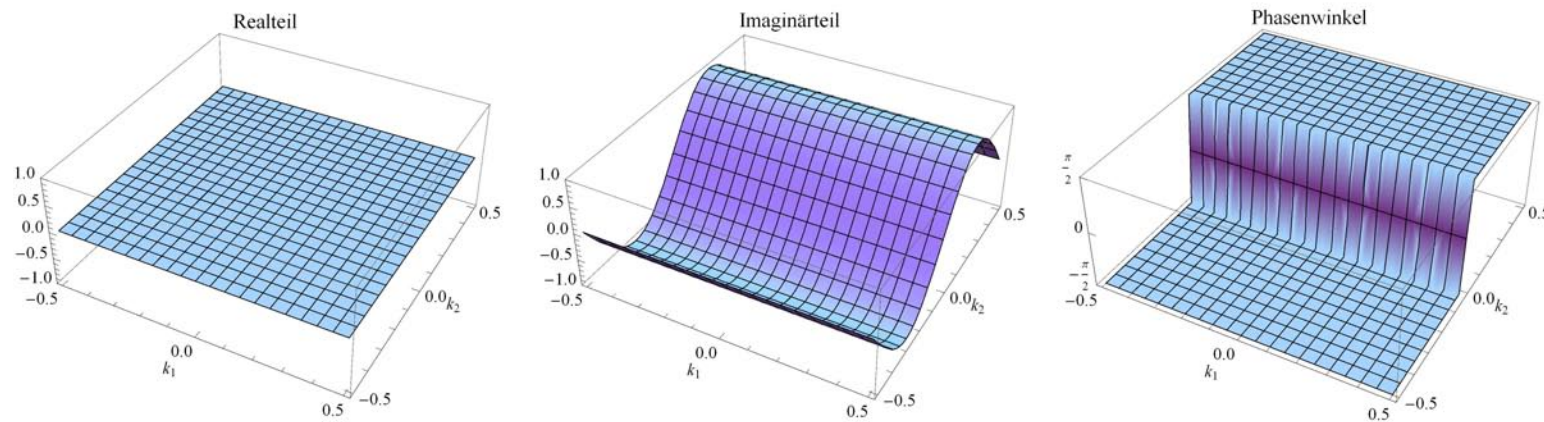
`i Sin[2 π k1]`



`Transpose[{identität[3]},{ableitungsymm} // MatrixForm`

$$\begin{pmatrix} 0 & 0 & 0 \\ \frac{1}{2} & 0 & -\frac{1}{2} \\ 0 & 0 & 0 \end{pmatrix}$$

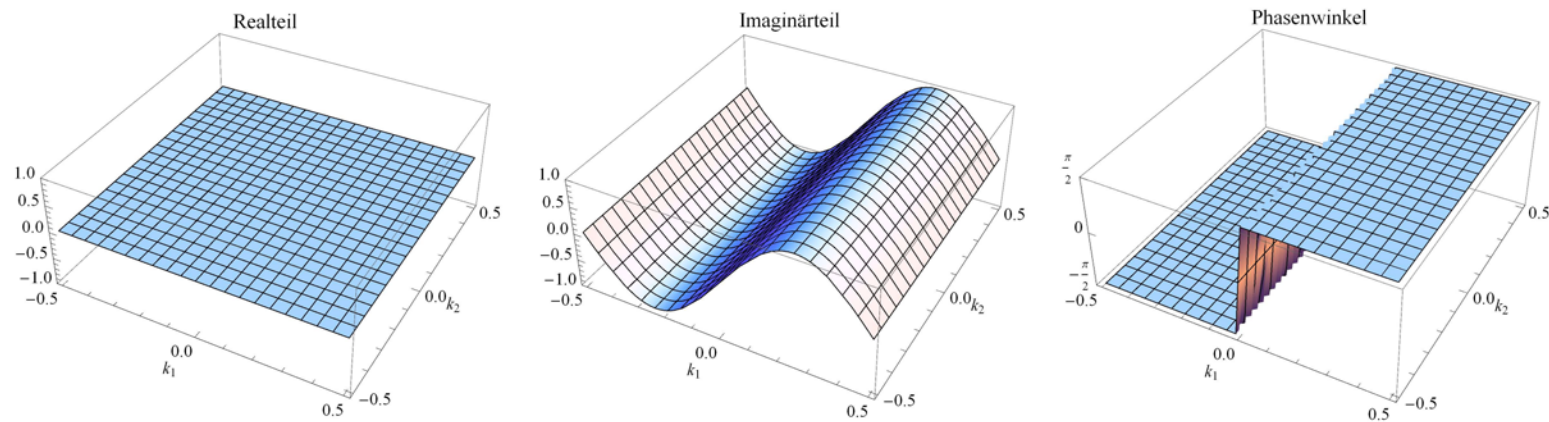

```
transferfunktion2d[Transpose[{identität[3]}].{ableitungsymp}]
Show[plottransferfunktion2d[transferfunktion2d[Transpose[{identität[3]}].{ableitungsymp}]], ImageSize -> 800]
i Sin[2 π k2]
```



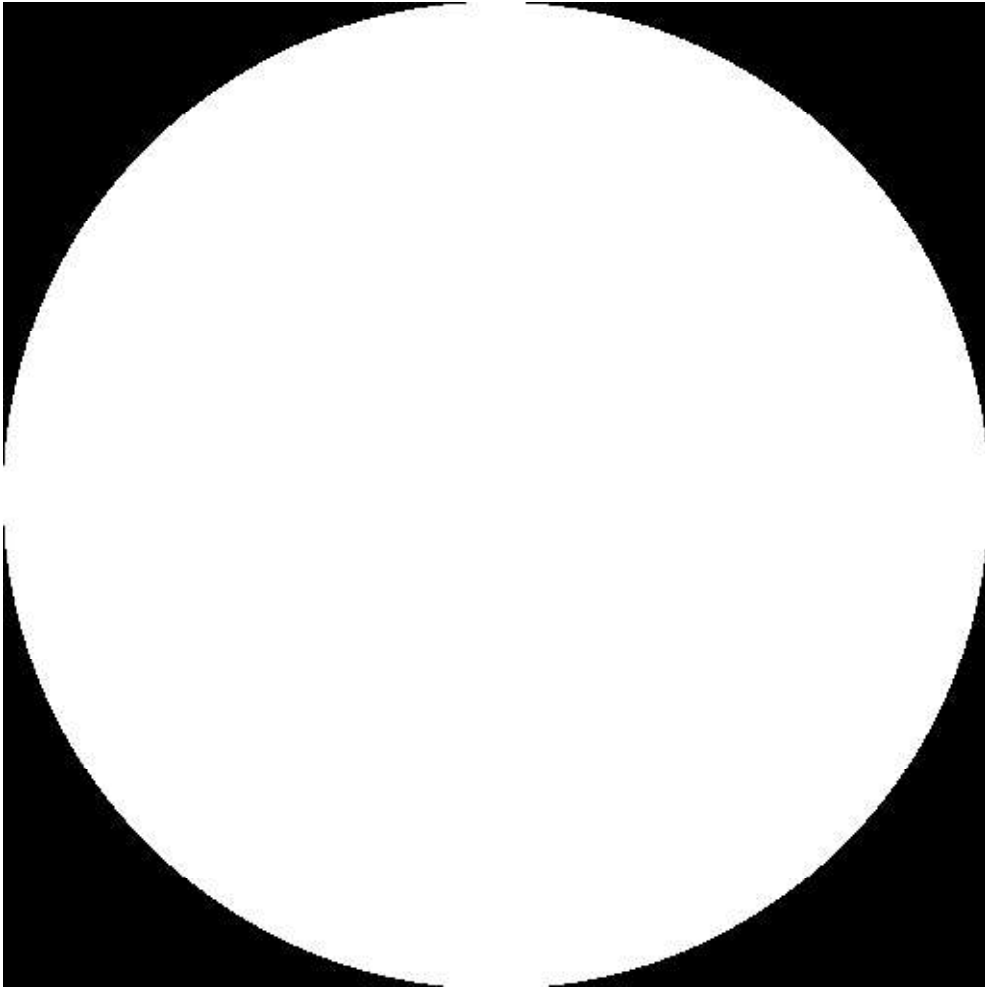
```
Transpose[{ableitungsymp}].{identität[3]} // MatrixForm
```

$$\begin{pmatrix} 0 & \frac{1}{2} & 0 \\ 0 & 0 & 0 \\ 0 & -\frac{1}{2} & 0 \end{pmatrix}$$

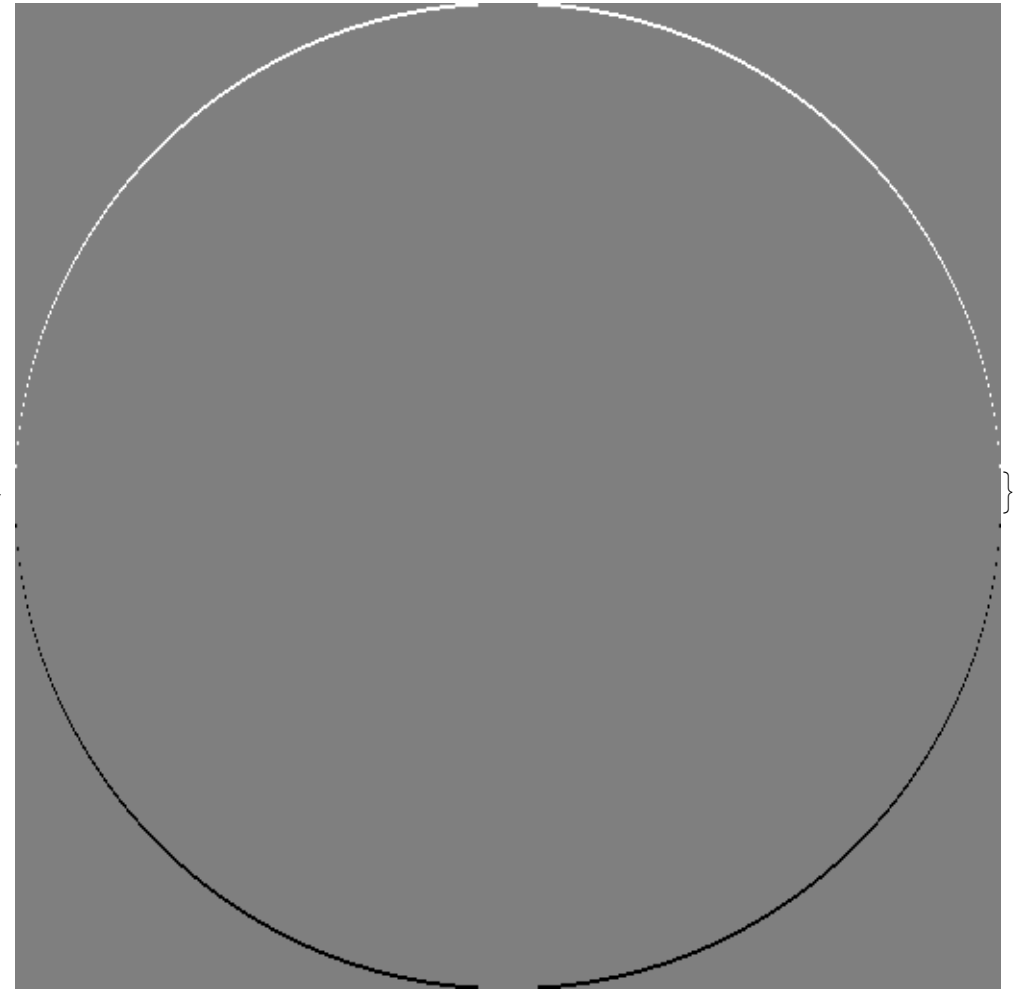
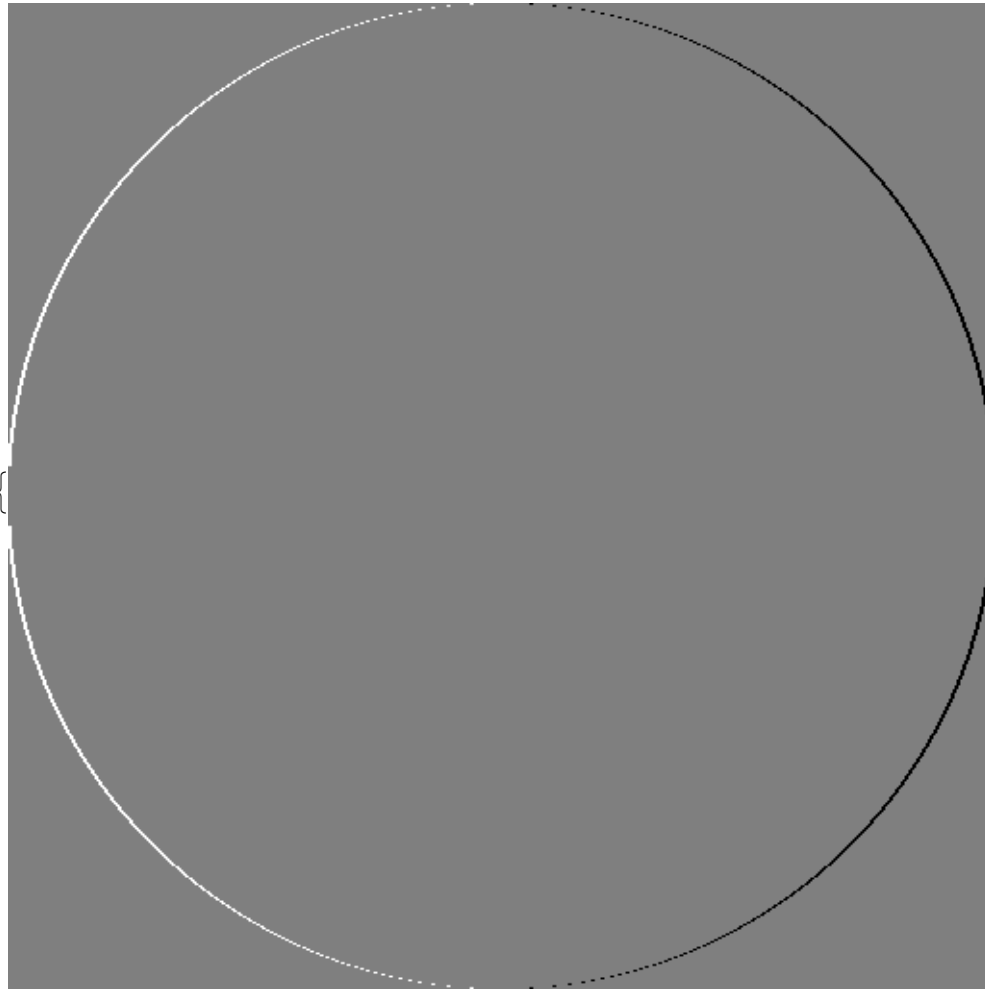

```
transferfunktion2d[Transpose[{ableitungsymm}].{identität[3]}]
Show[plottransferfunktion2d[transferfunktion2d[Transpose[{ableitungsymm}].{identität[3]}]], ImageSize -> 800]
i Sin[2 π k1]
```



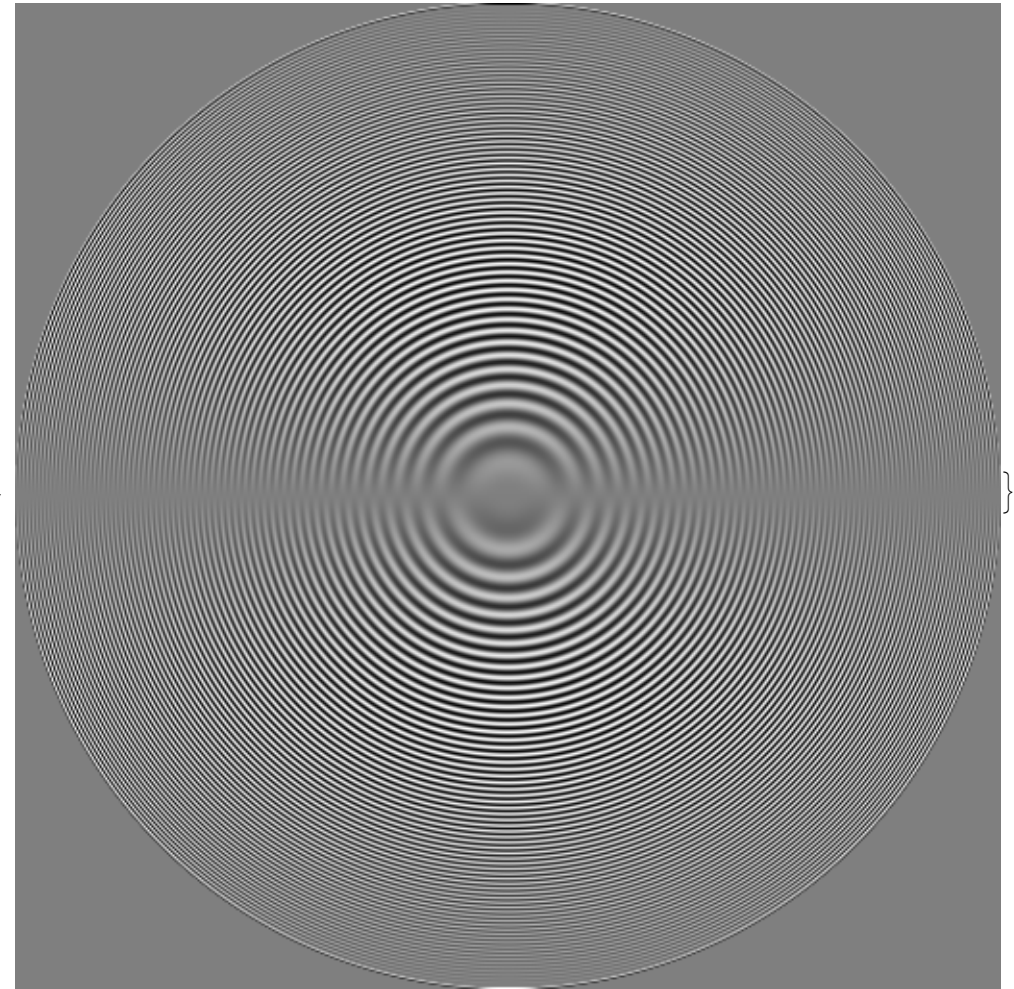
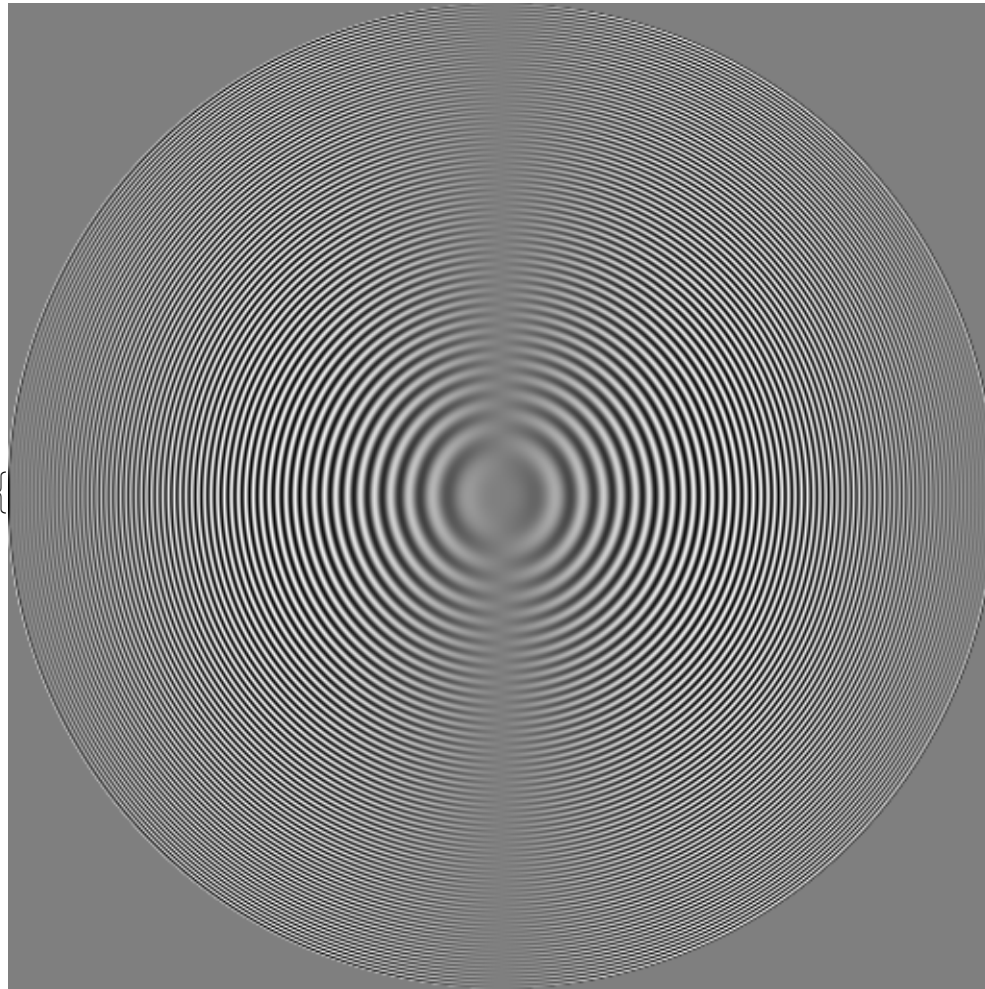
maske // Image



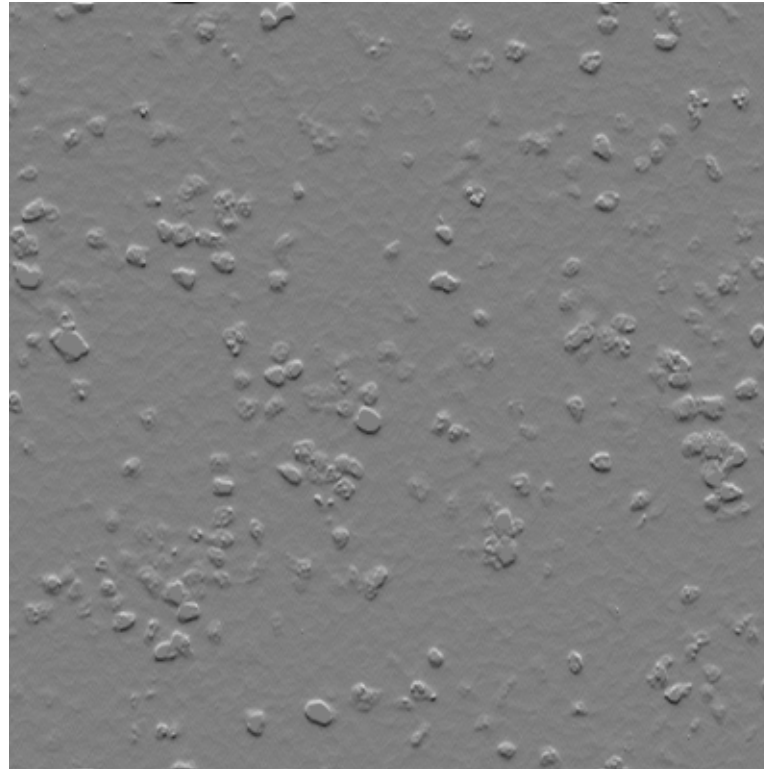
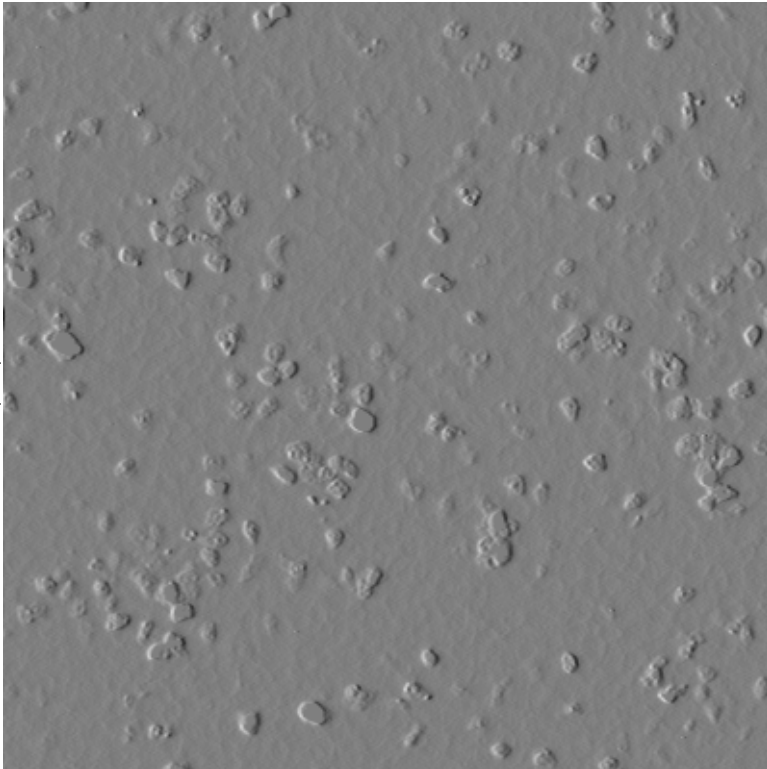
```
{Show[Image[0.5 + ListConvolve[#1, maske, {(Dimensions[#1] + 1) / 2}]], Show[Image[0.5 + ListConvolve[#2, maske, {(Dimensions[#2] + 1) / 2}]]]} &[
  Transpose[{identität[3]}].{ableitungsymm}, Transpose[{ableitungsymm}].{identität[3]}]
```



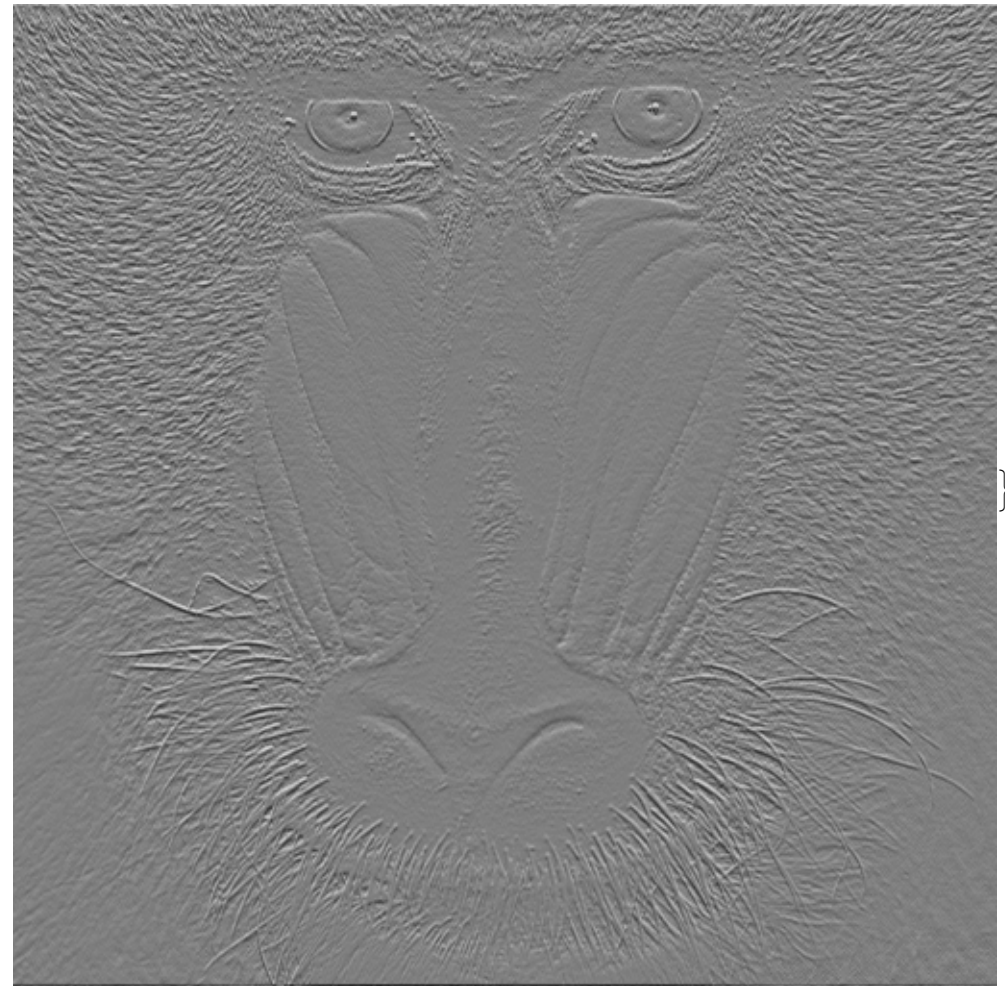
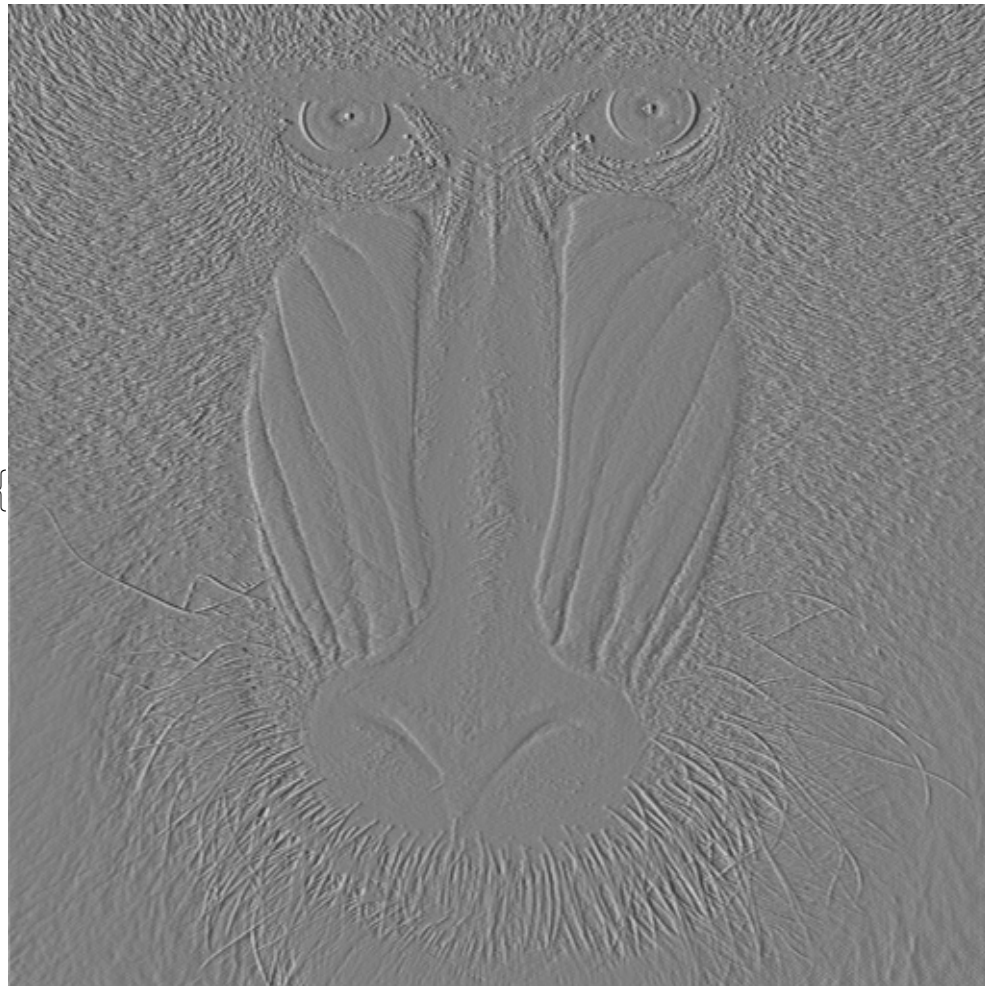
```
{Show[Image[0.5 + ListConvolve[#1, ImageData[wellenbild], {(Dimensions[#1] + 1) / 2}]]],  
  Show[Image[0.5 + ListConvolve[#2, ImageData[wellenbild], {(Dimensions[#2] + 1) / 2}]]] & [  
    Transpose[{identität[3]}].{ableitungsymm}, Transpose[{ableitungsymm}].{identität[3]}]
```



```
{Show[Image[0.5 + ListConvolve[#1, ImageData@ImageCrop[First@ColorSeparate@Lym3CD21dreikanalausgleichF2, {pagewidth / 2, pagewidth / 2}],
  {(Dimensions[#1] + 1) / 2}]], ImageSize → pagewidth / 2],
  Show[Image[0.5 + ListConvolve[#2, ImageData@ImageCrop[First@ColorSeparate@Lym3CD21dreikanalausgleichF2, {pagewidth / 2, pagewidth / 2}],
    {(Dimensions[#2] + 1) / 2}]], ImageSize → pagewidth / 2]} &[
Transpose[{identität[3]}].{ableitungsymp}, Transpose[{ableitungsymp}].{identität[3]}]
```



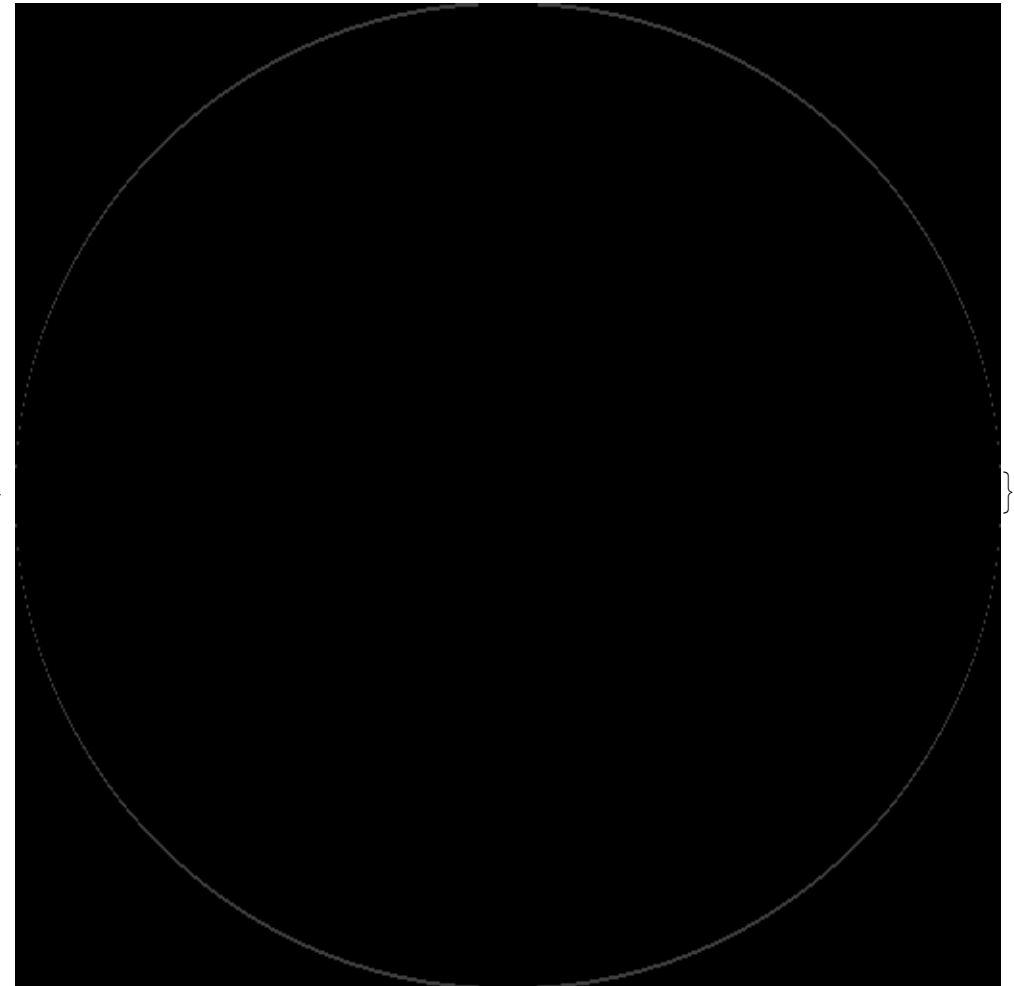
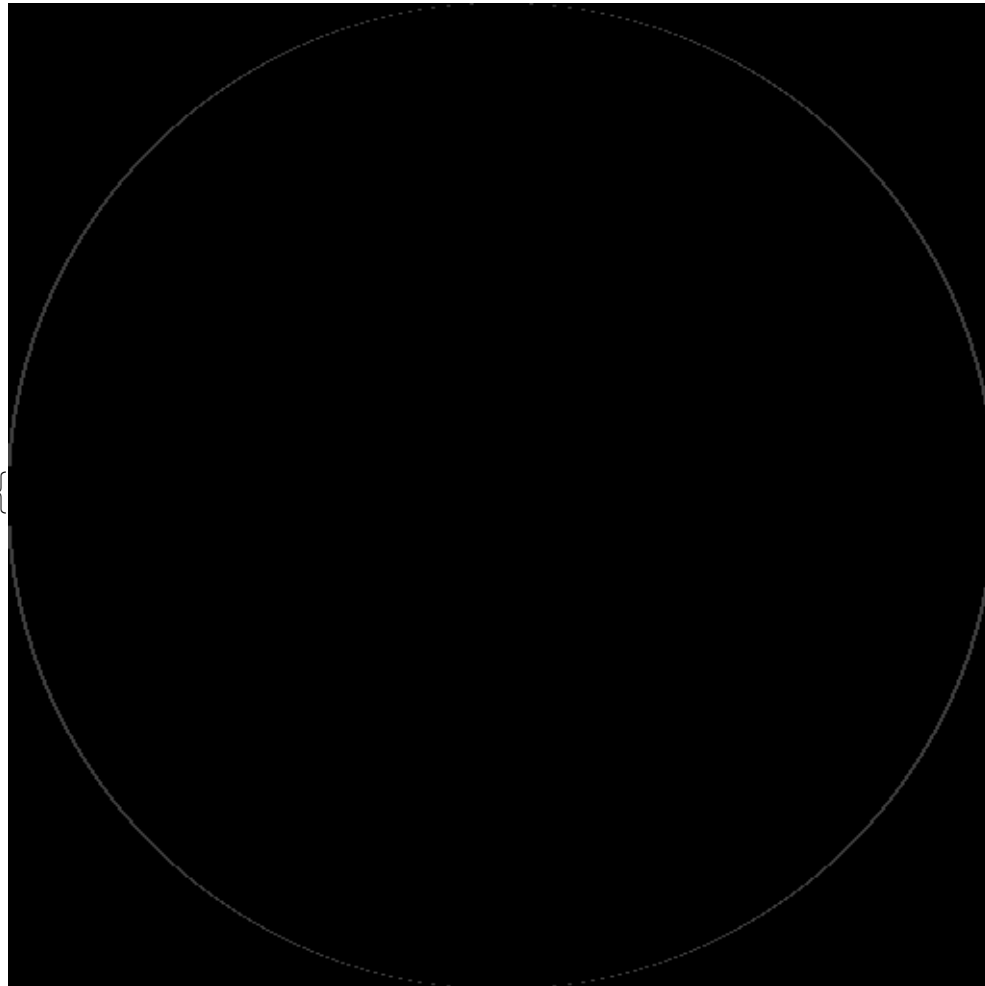
```
{Show[Image[0.5 + ListConvolve[#1,
    ImageData[ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Mandrill"}]]], {(Dimensions[#1] + 1) / 2}]],
    Show[Image[0.5 + ListConvolve[#2, ImageData[ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Mandrill"}]]],
        {(Dimensions[#2] + 1) / 2}]]]] &[
Transpose[{identität[3]}].{ableitungsymp}, Transpose[{ableitungsymp}].{identität[3]}]
```



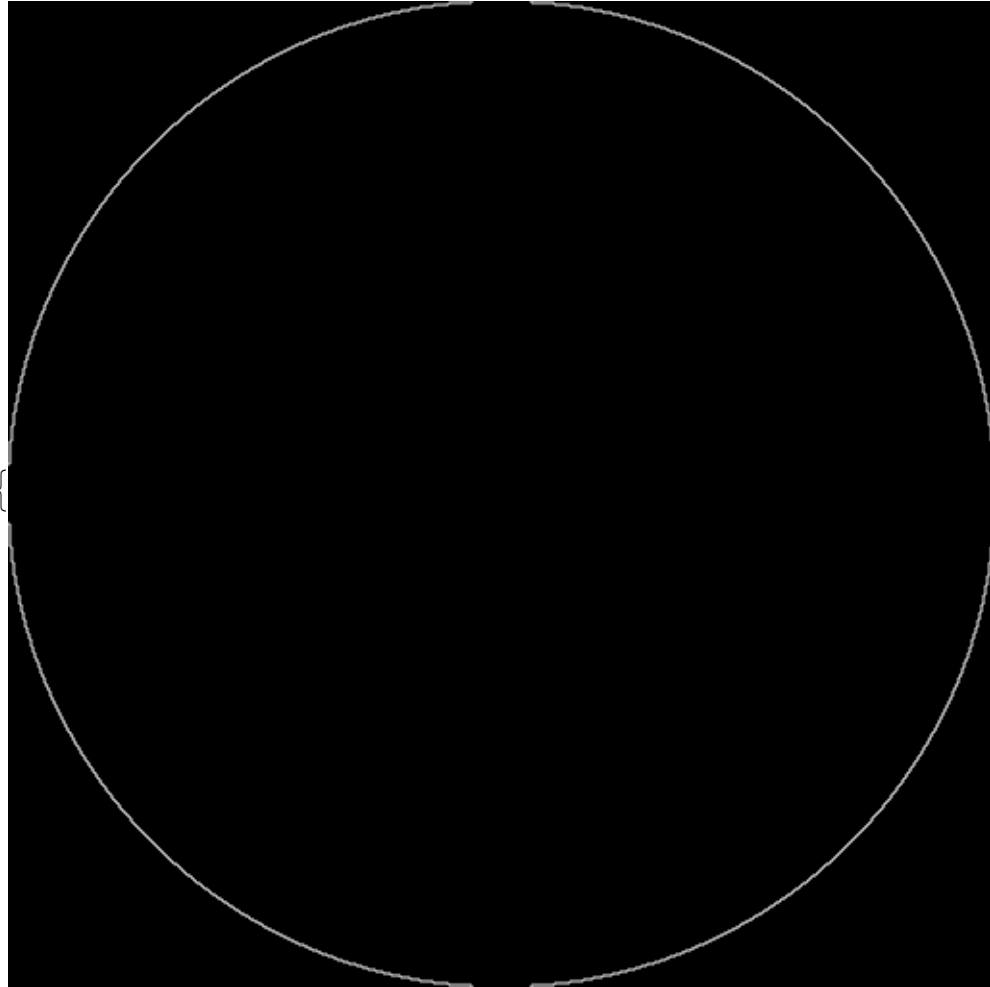
Um der erheblichen Richtungsabhängigkeit entgegenzuwirken, kann man tricksen:

- pixelweises Summieren der Quadrate der jeweiligen Richtungsableitungen und anschließendes Radizieren

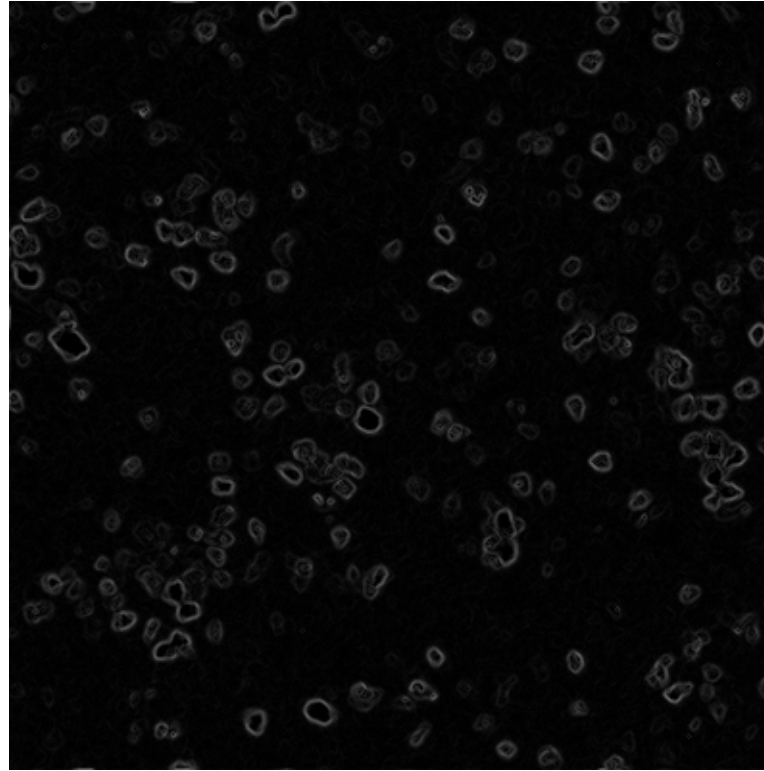
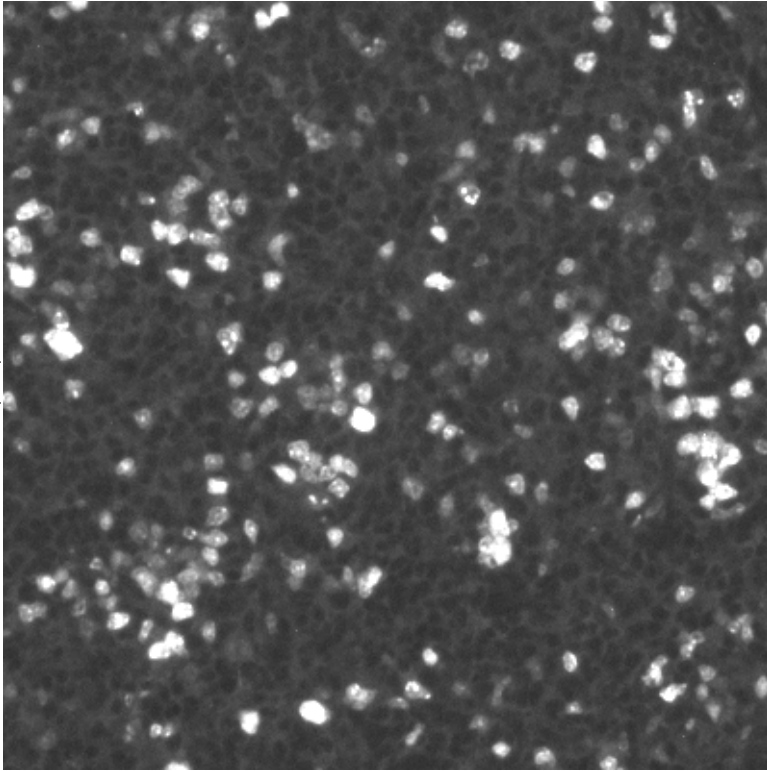
```
{Show[Image[ListConvolve[Transpose[{identität[3]}].{ableitungsymm}, #, {{2, 2}}]^2]],  
  Show[Image[ListConvolve[Transpose[{ableitungsymm}].{identität[3]}, #, {{2, 2}}]^2]] &[maske]}
```



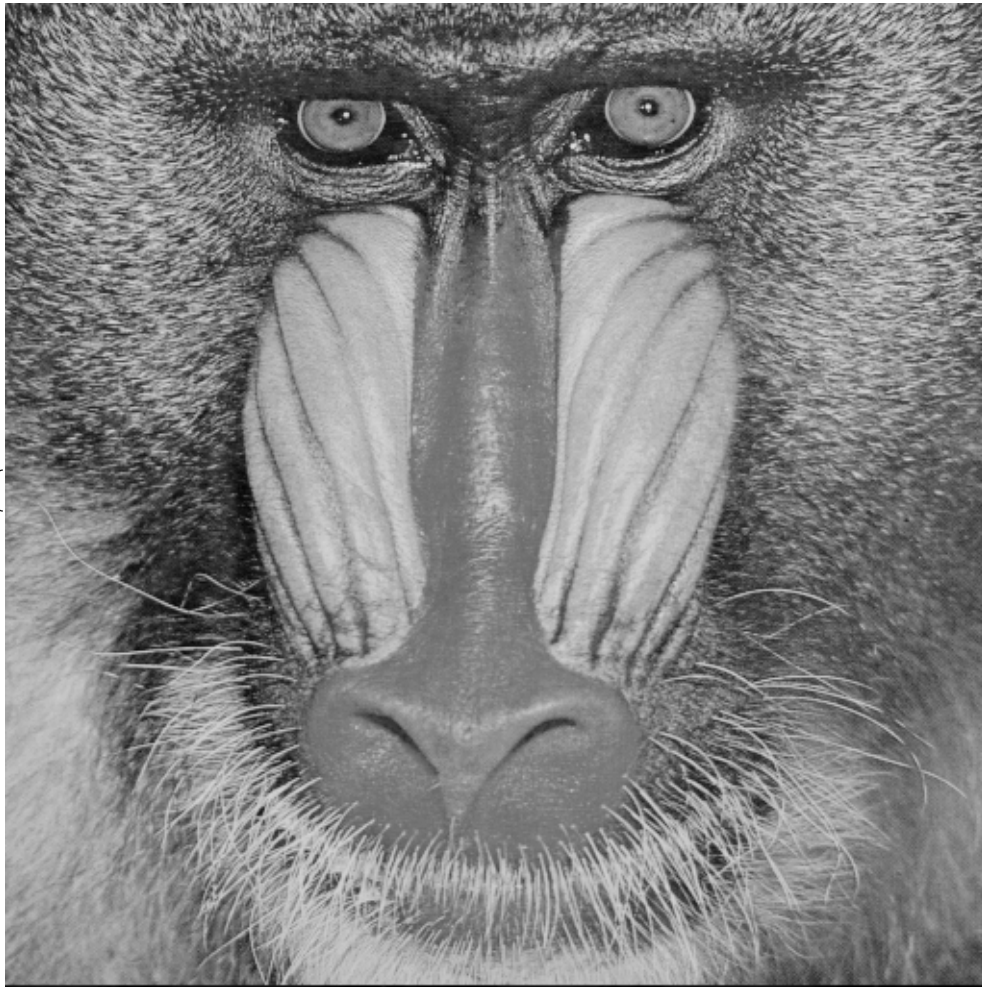
```
{Show[Image[Sqrt[ListConvolve[Transpose[{identität[3]}].{ableitungsymm}, #, {{2, 2}}]^2 +  
ListConvolve[Transpose[{ableitungsymm}].{identität[3]}, #, {{2, 2}}]^2]]] &[maske]
```



```
{Show[Image[#], ImageSize → pagewidth / 2], Show[Image[Sqrt[ListConvolve[Transpose[{identität[3]}].{ableitungsymm}], #, {{2, 2}}]^2 +
  ListConvolve[Transpose[{ableitungsymm}].{identität[3]}, #, {{2, 2}}]^2]], ImageSize → pagewidth / 2]} &[
  ImageData@ImageCrop[First@ColorSeparate@Lym3CD21dreikanalausgleichF2, {pagewidth / 2, pagewidth / 2}]]
```



```
{Show[Image[#]], Show[Image[Sqrt[ListConvolve[Transpose[{identität[3]}].{ableitungsymm}], #, {{2, 2}}]^2 +
  ListConvolve[Transpose[{ableitungsymm}].{identität[3]}, #, {{2, 2}}]^2]]] &[
  ImageData@ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Mandrill"}]]]
```



```
{Show[Image[#]], Show[Image[Sqrt[ListConvolve[Transpose[{identität[3]}.{ableitungsymm}], #, {{2, 2}}]^2 +
  ListConvolve[Transpose[{ableitungsymm}].[identität[3]], #, {{2, 2}}]^2]]] &[
  ImageData@ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Lena"}]]]
```



Gibt es verfeinerte Gradientenoperatoren?

Idee: mehr als zwei Richtungen, Querglättung

- Sobelfilter

```
Transpose[{binom[2]]} . {ableitungsymm} // MatrixForm
```

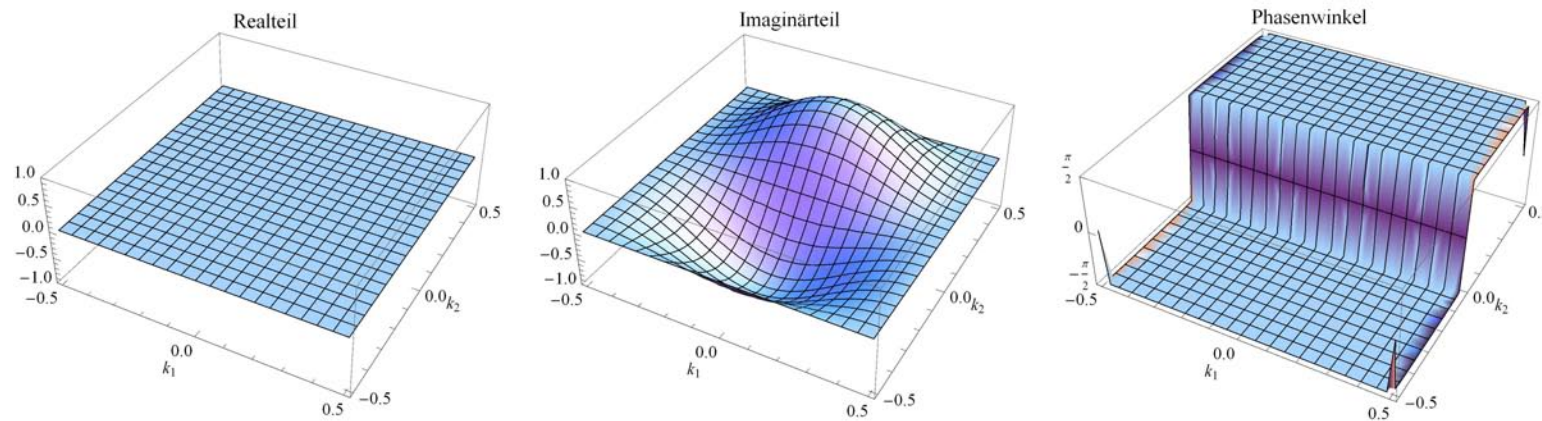
$$\begin{pmatrix} \frac{1}{8} & 0 & -\frac{1}{8} \\ \frac{1}{4} & 0 & -\frac{1}{4} \\ \frac{1}{8} & 0 & -\frac{1}{8} \end{pmatrix}$$

$$\text{sobel1} = \begin{pmatrix} \frac{1}{8} & 0 & -\frac{1}{8} \\ \frac{1}{4} & 0 & -\frac{1}{4} \\ \frac{1}{8} & 0 & -\frac{1}{8} \end{pmatrix};$$

```
transferfunktion2d[sobel1]
```

```
Show[plottransferfunktion2d[transferfunktion2d[sobel1]], ImageSize -> pagewidth]
```

$$i \cos[\pi k_1]^2 \sin[2 \pi k_2]$$




```
Transpose[{ableitungsymm}].{binom[2]} // MatrixForm
```

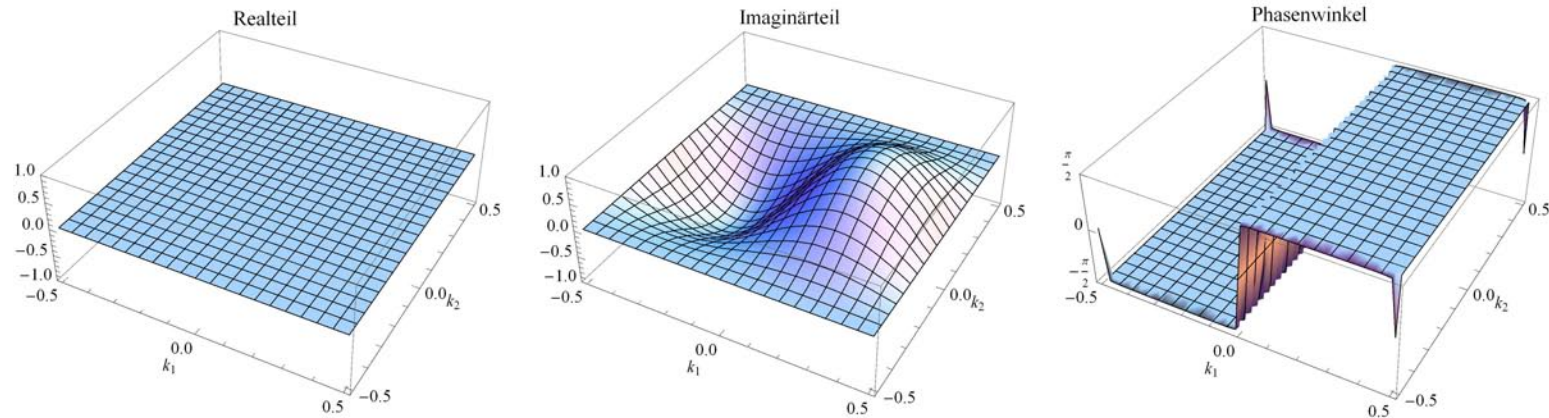
$$\begin{pmatrix} \frac{1}{8} & \frac{1}{4} & \frac{1}{8} \\ 0 & 0 & 0 \\ -\frac{1}{8} & -\frac{1}{4} & -\frac{1}{8} \end{pmatrix}$$

$$\text{sobel2} = \begin{pmatrix} \frac{1}{8} & \frac{1}{4} & \frac{1}{8} \\ 0 & 0 & 0 \\ -\frac{1}{8} & -\frac{1}{4} & -\frac{1}{8} \end{pmatrix};$$

```
transferfunktion2d[sobel2]
```

```
Show[plottransferfunktion2d[transferfunktion2d[sobel2]], ImageSize -> pagewidth]
```

$$i \cos[\pi k_2]^2 \sin[2 \pi k_1]$$

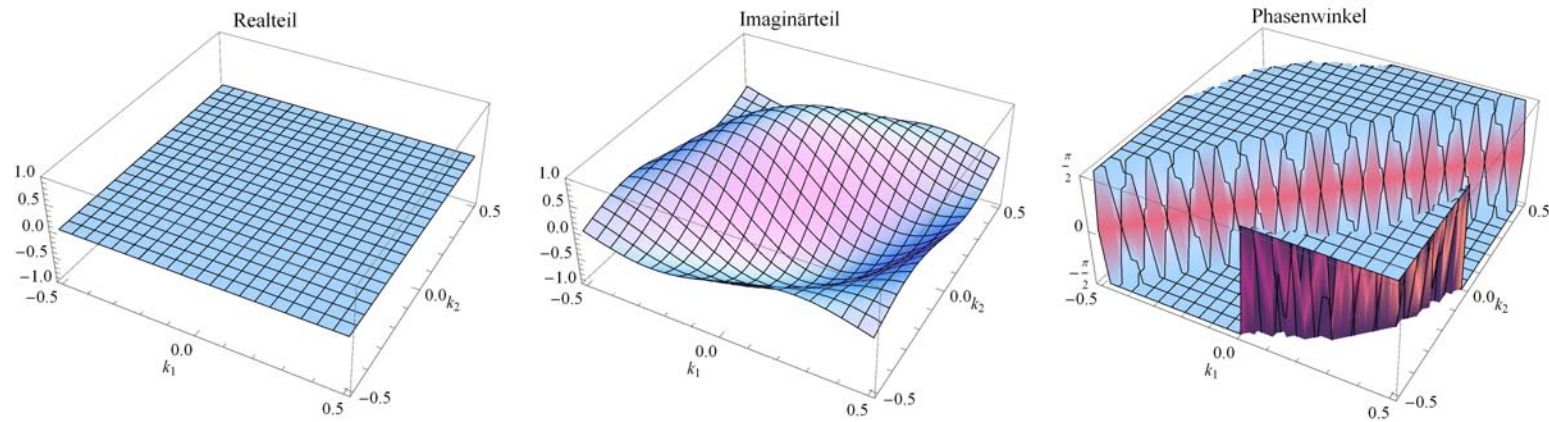


$$\text{sobel3} = \begin{pmatrix} 0 & -\frac{1}{8} & -\frac{1}{4} \\ \frac{1}{8} & 0 & -\frac{1}{8} \\ \frac{1}{4} & \frac{1}{8} & 0 \end{pmatrix};$$

```
transferfunktion2d[sobel3]
```

```
Show[plottransferfunktion2d[transferfunktion2d[sobel3]], ImageSize -> pagewidth]
```

$$-\frac{1}{4} i (\sin[2 \pi k_1] + 2 \sin[2 \pi (k_1 - k_2)] - \sin[2 \pi k_2])$$

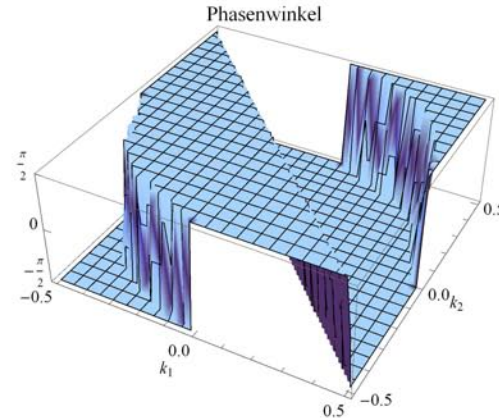
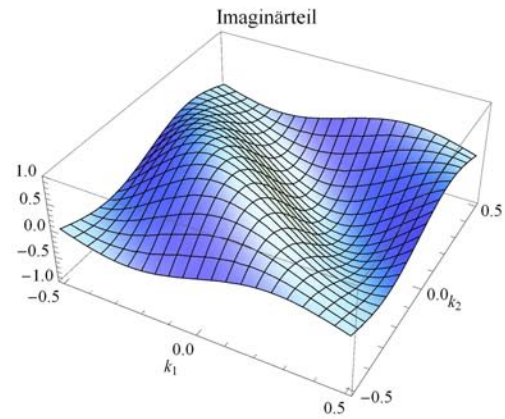
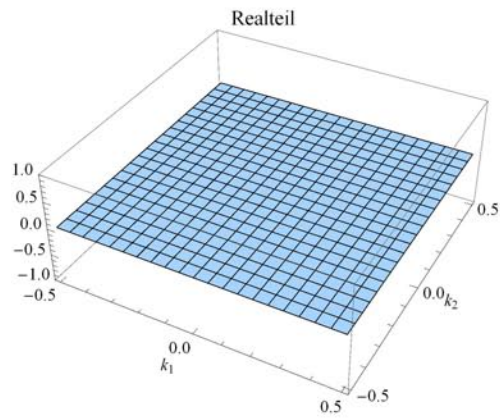


$$\text{sobel4} = \begin{pmatrix} -\frac{1}{4} & -\frac{1}{8} & 0 \\ -\frac{1}{8} & 0 & \frac{1}{8} \\ 0 & \frac{1}{8} & \frac{1}{4} \end{pmatrix};$$

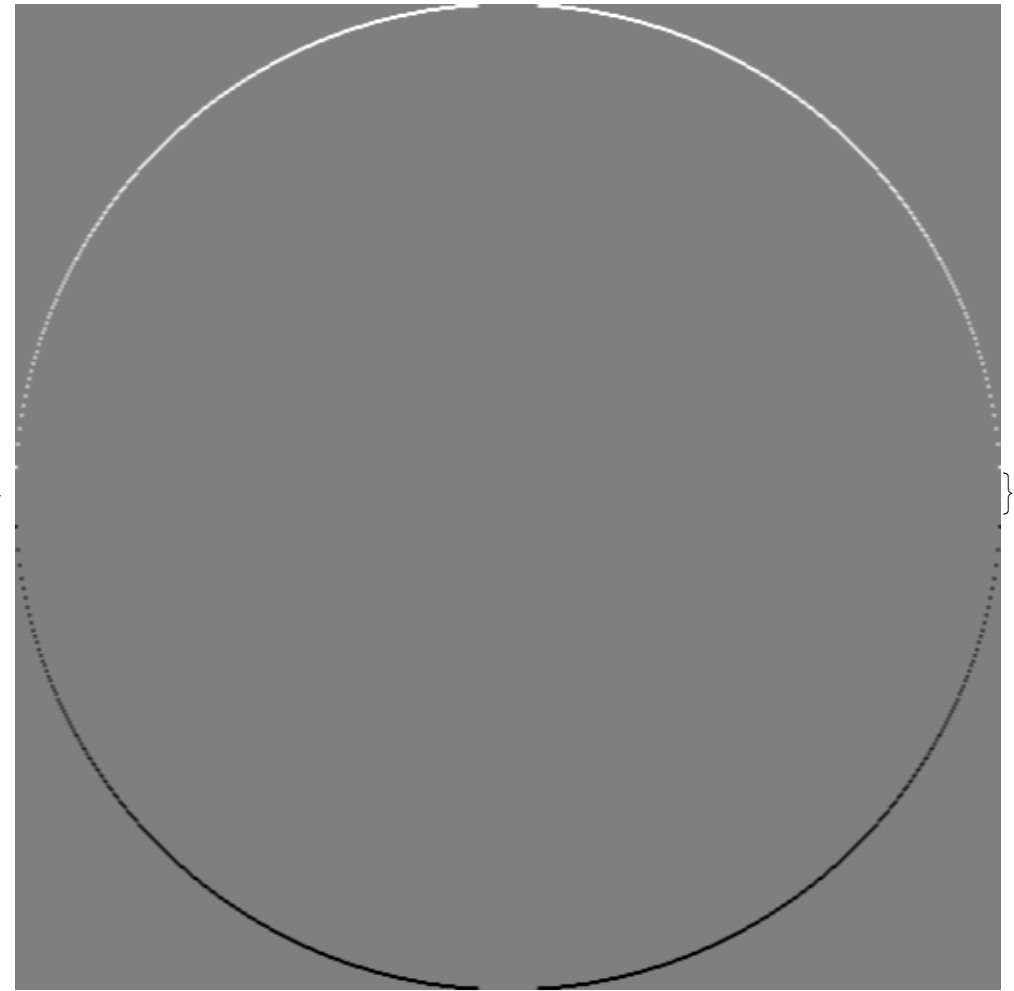
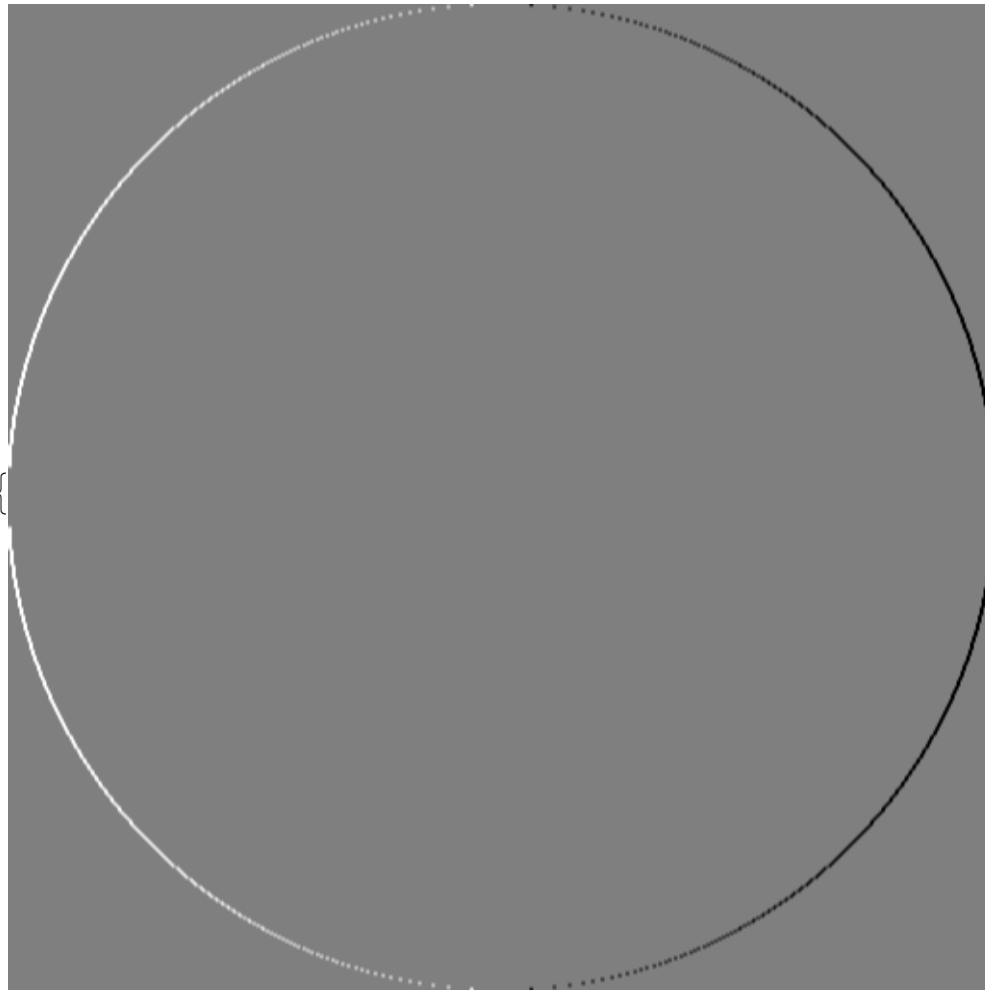
```
transferfunktion2d[sobel4]
```

```
Show[plottransferfunktion2d[transferfunktion2d[sobel4]], ImageSize -> pagewidth]
```

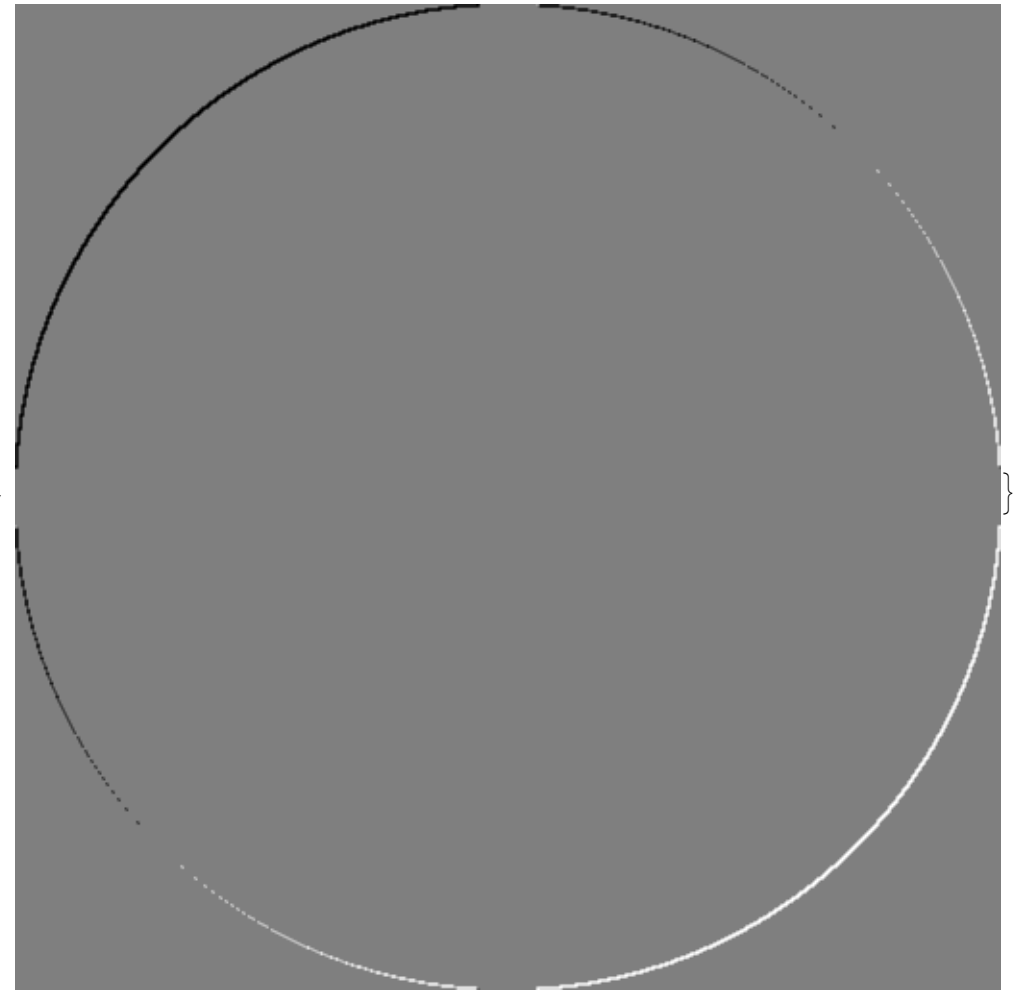
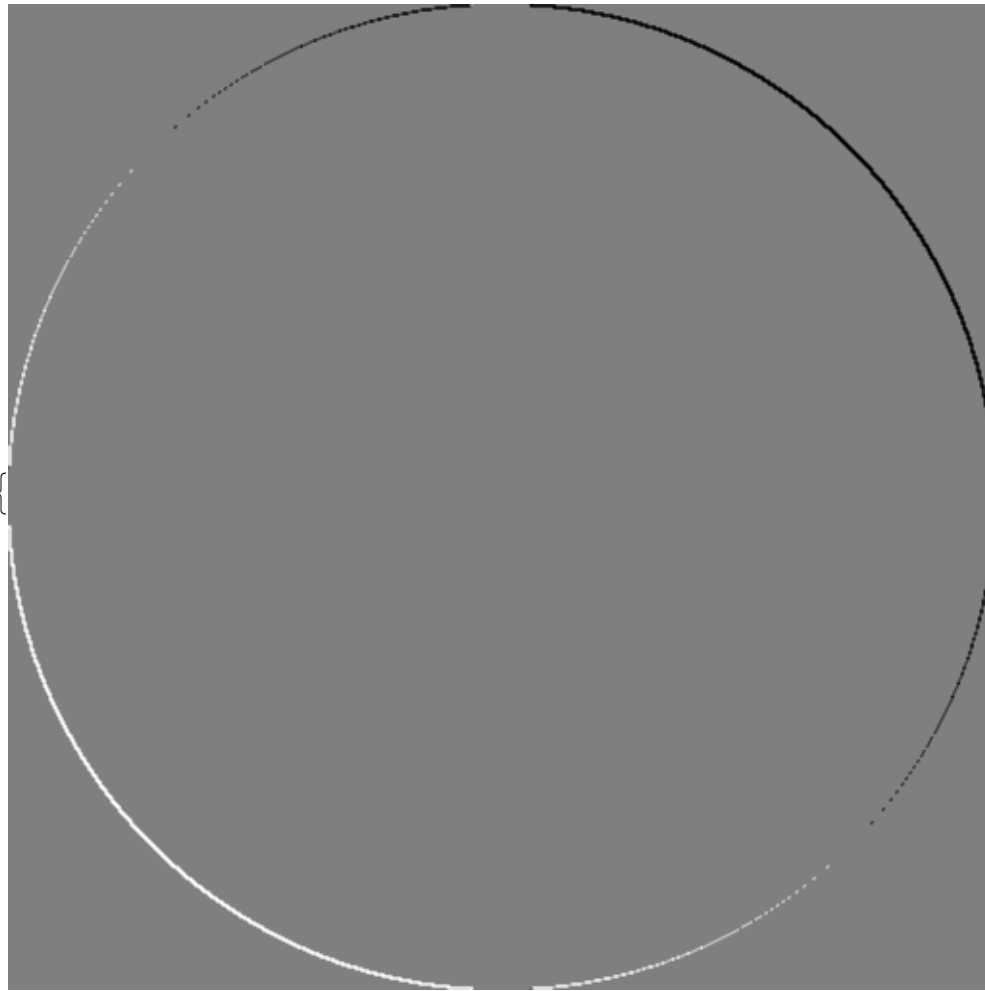
$$-\frac{1}{4} i (\sin[2 \pi k_1] + \sin[2 \pi k_2] + 2 \sin[2 \pi (k_1 + k_2)])$$



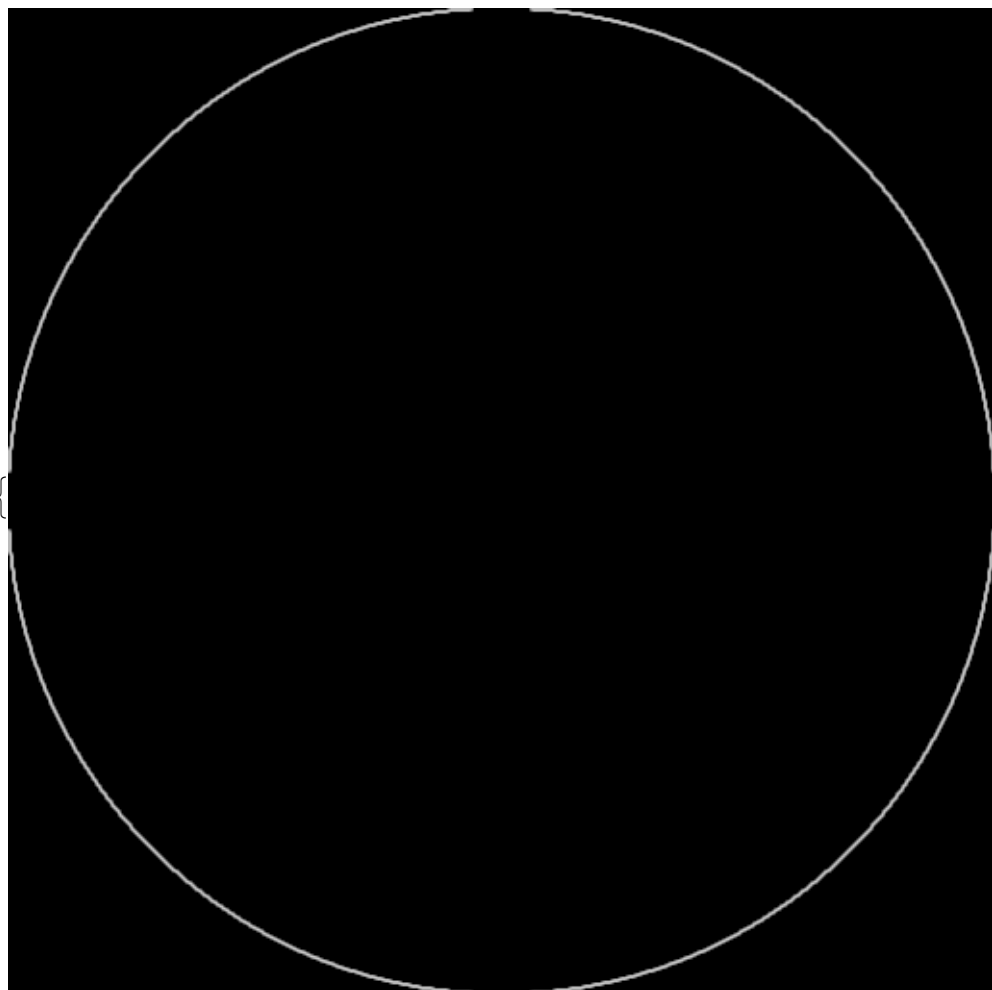
```
{Show[Image[0.5 + ListConvolve[sobel1, #, {{2, 2}}]]], Show[Image[0.5 + ListConvolve[sobel2, #, {{2, 2}}]]]} &[maske]
```



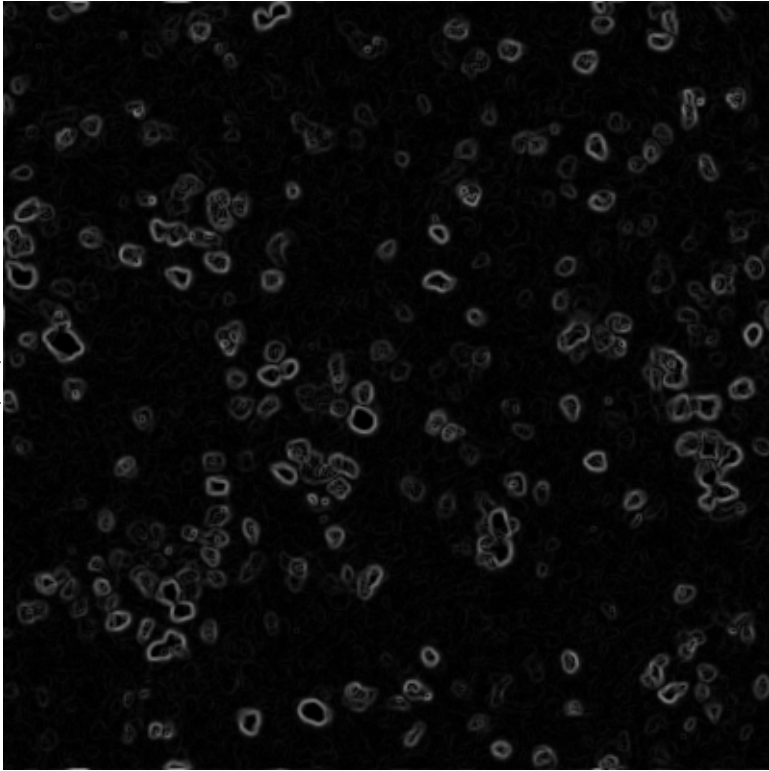
```
{Show[Image[0.5 + ListConvolve[sobel3, #, {{2, 2}}]]], Show[Image[0.5 + ListConvolve[sobel4, #, {{2, 2}}]]]} &[maske]
```



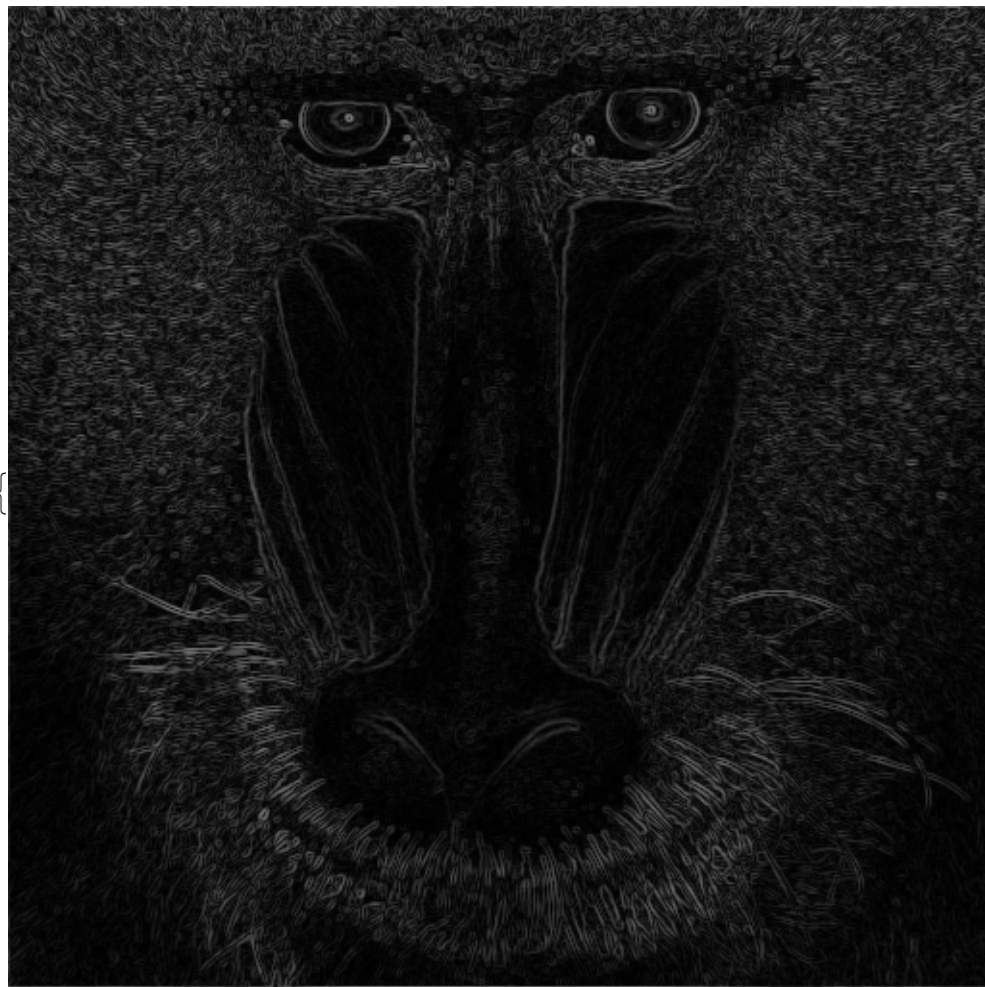
```
{Show[Image[Sqrt[ListConvolve[sobel1, #, {{2, 2}}]^2 + ListConvolve[sobel2, #, {{2, 2}}]^2 +  
ListConvolve[sobel3, #, {{2, 2}}]^2 + ListConvolve[sobel4, #, {{2, 2}}]^2]]] &[maske]
```




```
{Show[Image[Sqrt[ListConvolve[sobel1, #, {{2, 2}}]^2 + ListConvolve[sobel2, #, {{2, 2}}]^2 +  
    ListConvolve[sobel3, #, {{2, 2}}]^2 + ListConvolve[sobel4, #, {{2, 2}}]^2]], ImageSize → pagewidth / 2]] &[  
    ImageData@ImageCrop[First@ColorSeparate@Lym3CD21dreikanalausgleichF2, {pagewidth / 2, pagewidth / 2}]]]
```



```
{Show[Image[Sqrt[ListConvolve[sobel1, #, {{2, 2}}]^2 +  
    ListConvolve[sobel2, #, {{2, 2}}]^2 + ListConvolve[sobel3, #, {{2, 2}}]^2 + ListConvolve[sobel4, #, {{2, 2}}]^2]]] &[  
ImageData@ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Mandrill"}]]]
```



```
{Show[Image[Sqrt[ListConvolve[sobel1, #, {{2, 2}}]^2 +
  ListConvolve[sobel2, #, {{2, 2}}]^2 + ListConvolve[sobel3, #, {{2, 2}}]^2 + ListConvolve[sobel4, #, {{2, 2}}]^2]]] &[
  ImageData@ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Lena"}]]]
```



Approximation von Ableitungsoperatoren 2. Ordnung durch lineare Filter

Idee: aus zweimaliger Anwendung von Ableitungsoperatoren, Unabhängigkeit von konstanten Änderungen

- Laplacefilter
- Addition der beiden Richtungs-Laplacefilter

ableitungsymm

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

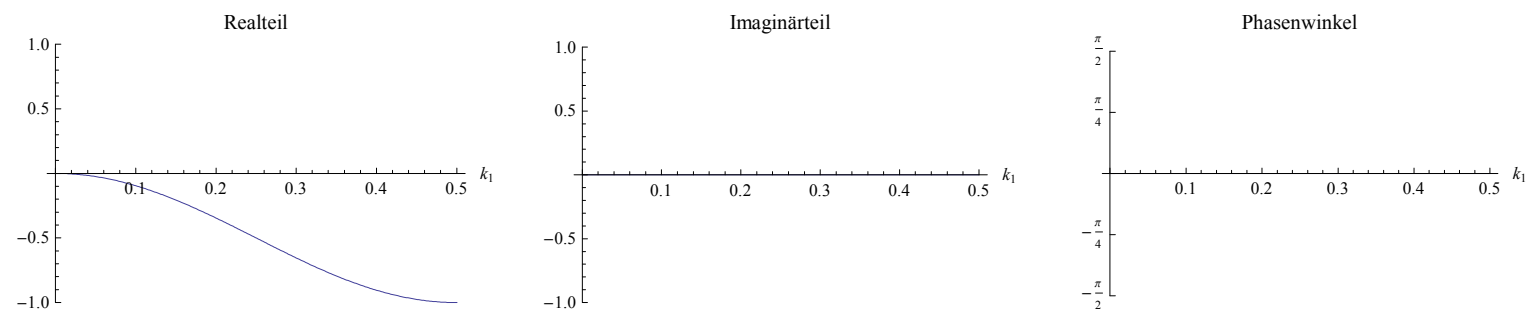
ListConvolve[ableitungsymm, ableitungsymm, 2]

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

transferfunktion[ListConvolve[ableitungsymm, ableitungsymm, 2]]

Show[plottransferfunktion[transferfunktion[ListConvolve[ableitungsymm, ableitungsymm, 2]]], ImageSize → pagewidth]

$$-\sin[\pi k_1]^2$$



laplacekern = Transpose[{identität[3]}] . {ListConvolve[ableitungsymm, ableitungsymm, 2]} +

Transpose[{ListConvolve[ableitungsymm, ableitungsymm, 2]}] . {identität[3]};

(*als Addition für diesen einfachsten Fall!*)

laplacekern // MatrixForm

$$\begin{pmatrix} 0 & \frac{1}{4} & 0 \\ \frac{1}{4} & -1 & \frac{1}{4} \\ 0 & \frac{1}{4} & 0 \end{pmatrix}$$

```
Transpose[{identität[3]}.{ListConvolve[ableitungminus, ableitungplus, 2]} // MatrixForm
```

$$\begin{pmatrix} 0 & 0 & 0 \\ 1 & -2 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

```
Transpose[{ListConvolve[ableitungminus, ableitungplus, 2]}.{identität[3]} // MatrixForm
```

$$\begin{pmatrix} 0 & 1 & 0 \\ 0 & -2 & 0 \\ 0 & 1 & 0 \end{pmatrix}$$

```
(Transpose[{ListConvolve[ableitungminus, ableitungplus, 2]}.{identität[3]} +  
  Transpose[{identität[3]}.{ListConvolve[ableitungminus, ableitungplus, 2]}) / 4 // MatrixForm
```

$$\begin{pmatrix} 0 & \frac{1}{4} & 0 \\ \frac{1}{4} & -1 & \frac{1}{4} \\ 0 & \frac{1}{4} & 0 \end{pmatrix}$$

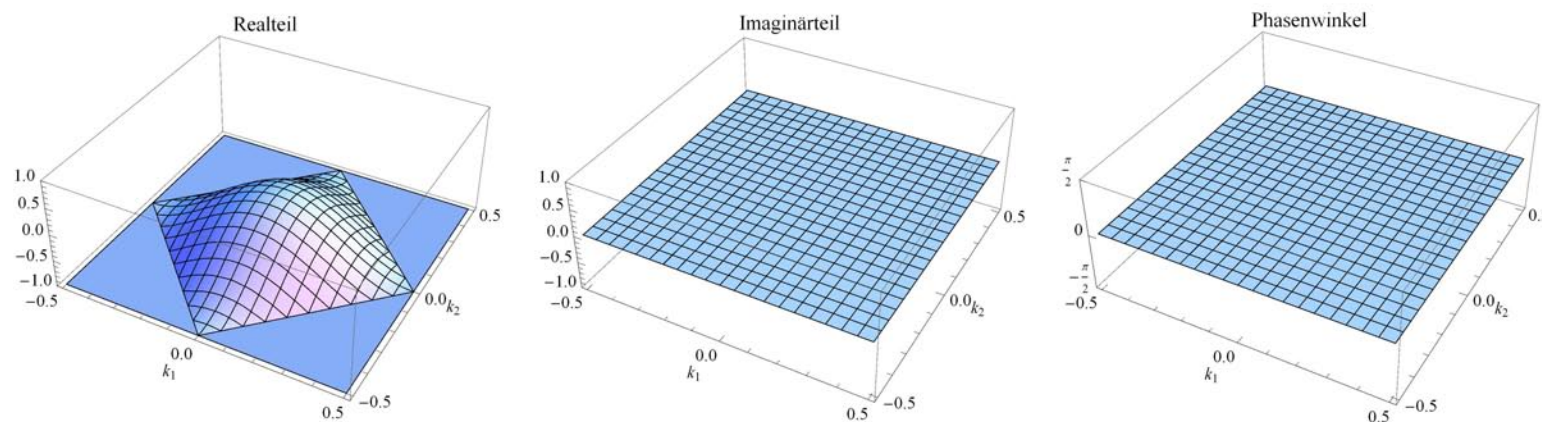
```
MatrixRank[laplacekern]
```

```
2
```

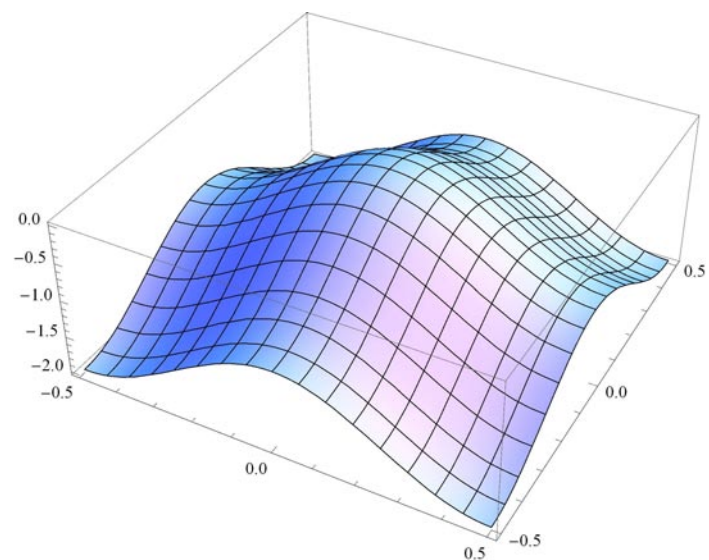
```
transferfunktion2d[laplacekern]
```

```
Show[plottransferfunktion2d[transferfunktion2d[laplacekern]], ImageSize -> pagewidth]
```

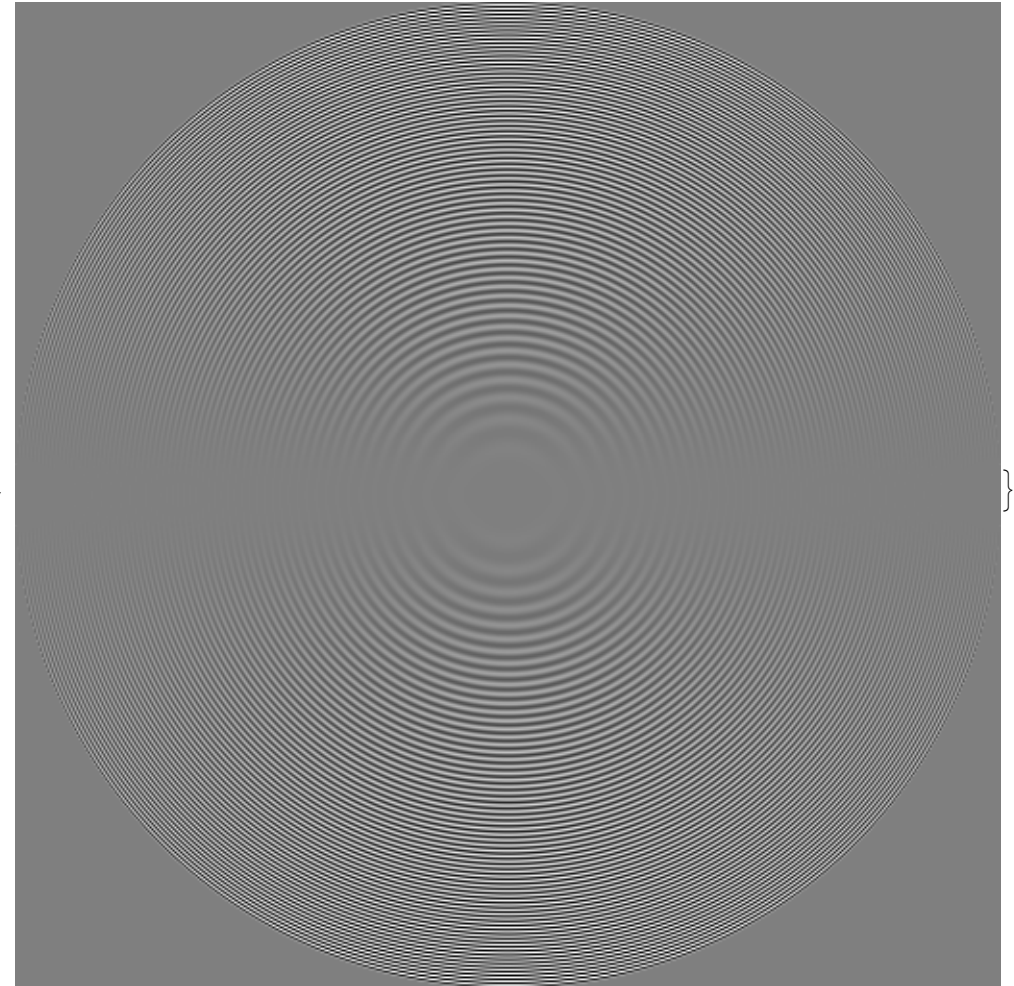
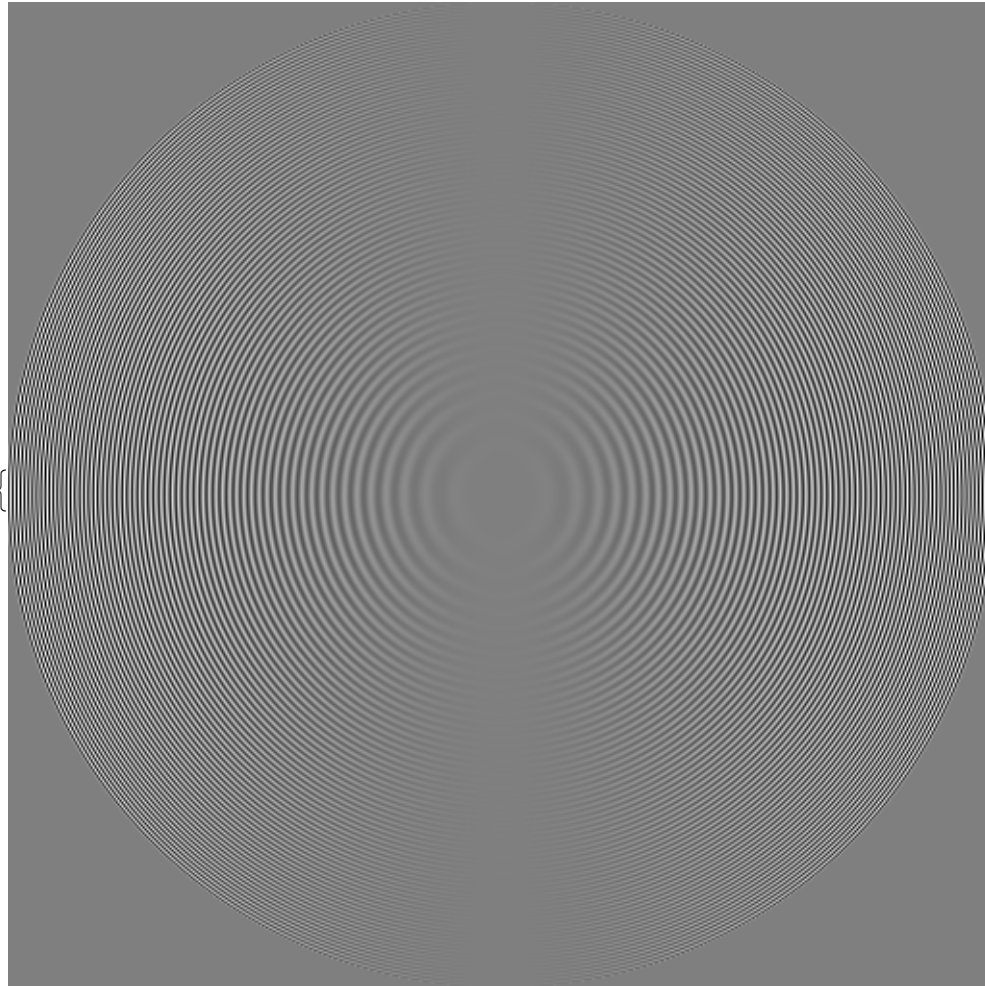
$$\frac{1}{2} (-2 + \cos[2\pi k_1] + \cos[2\pi k_2])$$



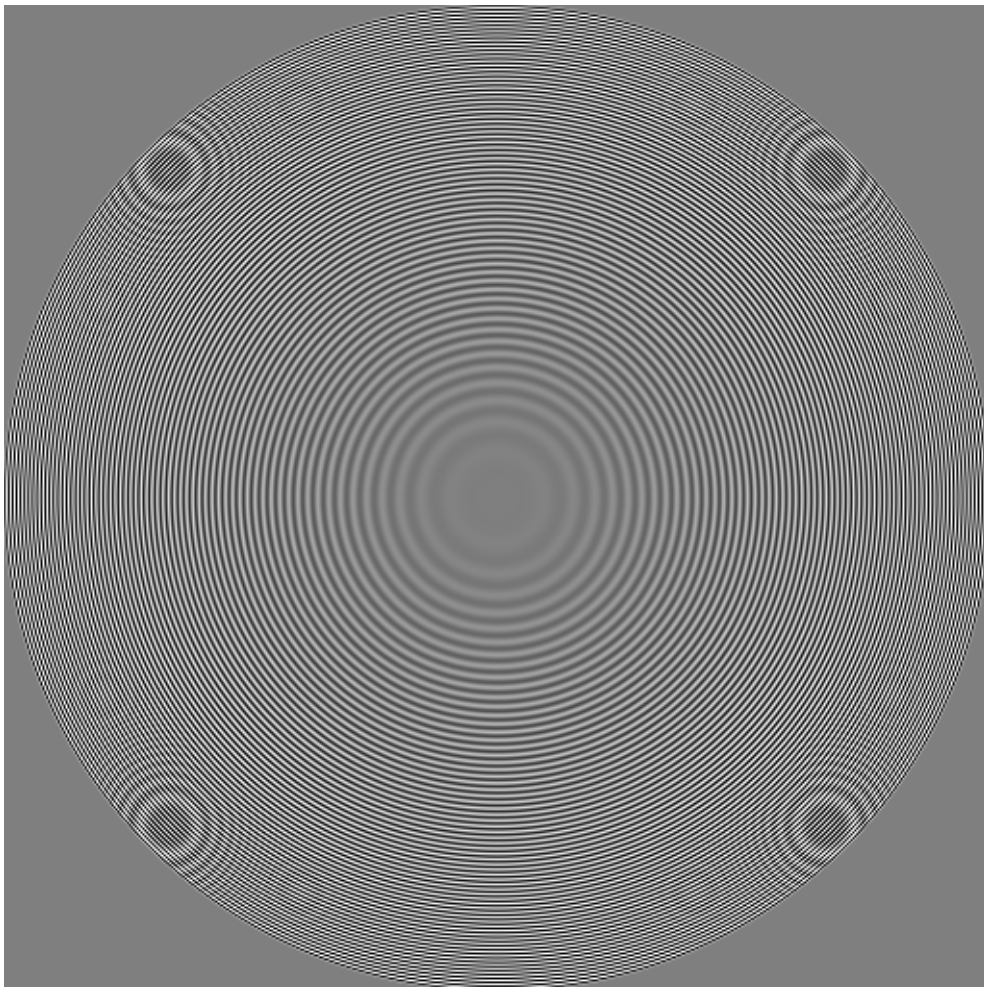
```
Plot3D[Evaluate[transferfunktion2d[laplacekern]], {k1, -1/2, 1/2}, {k2, -1/2, 1/2}]
```




```
{Show[Image[0.5 + ListConvolve[#1, ImageData[wellenbild], {(Dimensions[#1] + 1) / 2}]]],
  Show[Image[0.5 + ListConvolve[#2, ImageData[wellenbild], {(Dimensions[#2] + 1) / 2}]]]} &[
Transpose[{identität[3]}].{ListConvolve[ableitungsymm, ableitungsymm, 2]},
Transpose[{ListConvolve[ableitungsymm, ableitungsymm, 2]}].{identität[3]}]
```

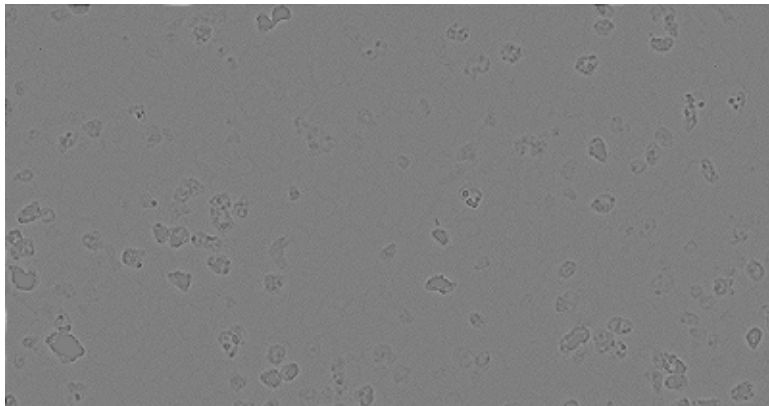
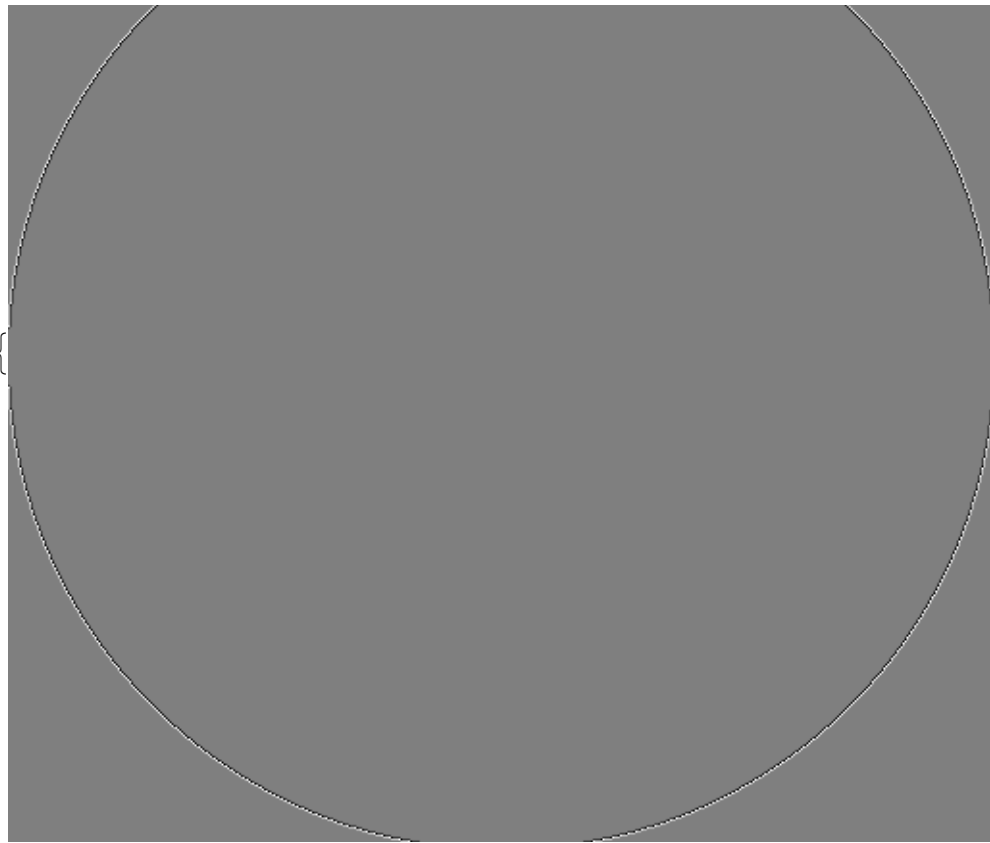


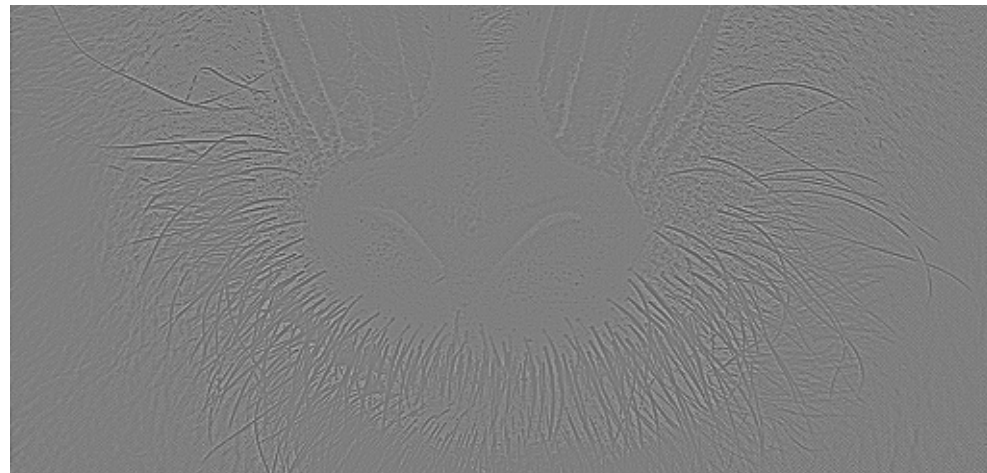
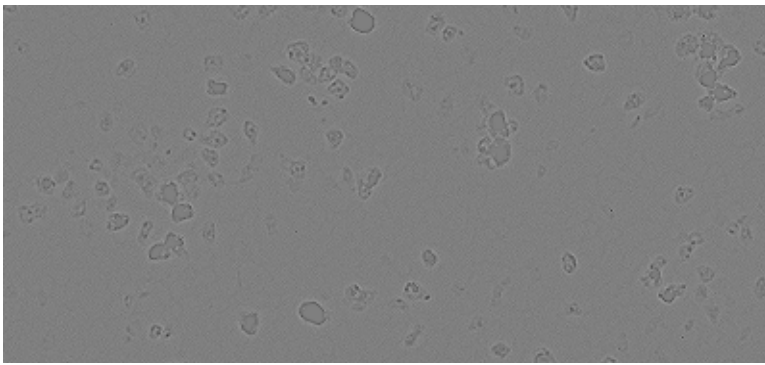
```
Show[Image[0.5 + ListConvolve[#1, #2, {(Dimensions[#1] + 1) / 2}]] &[laplacekern, ImageData[wellenbild]]
```



```
{Show[Image[0.5 + ListConvolve[#1, maske, {(Dimensions[#1] + 1) / 2}]],  
  Show[Image[0.5 + ListConvolve[#1, ImageData@ImageCrop[First@ColorSeparate@Lym3CD21dreikanalausgleichF2, {pagewidth / 2, pagewidth / 2}],  
    {(Dimensions[#1] + 1) / 2}]], ImageSize → pagewidth / 2],  
  Show[Image[0.5 + ListConvolve[#1, ImageData[ImageApply[{0.299, 0.587, 0.114}].# &, ExampleData[{"TestImage", "Mandrill"}]]],  
    {(Dimensions[#1] + 1) / 2}]]] &[laplacekern]
```





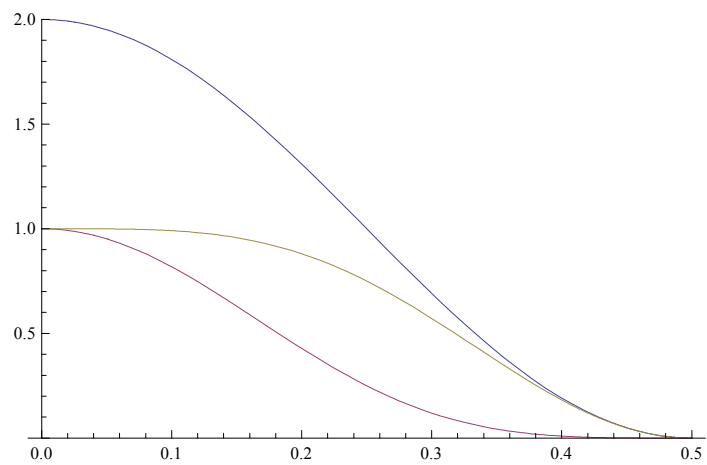


Zusatz: Wie kann man die Glättungsfilter “versteilern”?

Glättungsfilter 1D mit steilerem Abfall:

- durch geeignete Kombination des Identitätsoperators $I = (0, 1, 0)$ mit der einfachen Binomialmaske zweiter Ordnung ${}^2B = (1/4, 1/2, 1/4)$
- steilerer Abfall zu höheren Wellenzahlen hin
- Ansatz für einen entsprechenden Filter zweiter Ordnung: ${}^{(2,1)}B = I - (I - {}^2B)^2 = I - I^2 + 2 \cdot {}^2B - {}^2B^2 = 2 \cdot {}^2B - {}^4B$
- Verallgemeinerter Ansatz: ${}^{(n,l)}B = [I - (I - {}^2B)^n]^l$
- Verallgemeinerter Ansatz: ${}^{(n,l)}\hat{B} = \left\{ 1 - \frac{1}{2^n} [1 - \cos(2\pi k)]^n \right\}^l$
- Koeffizienten des Filters zweiter Ordnung: ${}^{(2,1)}B = 2 \cdot {}^2B - {}^4B$

```
Plot[Evaluate@{2 transferfunktion[binom[2]], transferfunktion[binom[4]],
  transferfunktion[2 ListConvolve[binom[2], identität[5], 2] - binom[4]]}, {k1, 0, kmax}, PlotRange -> {Full, {-0, 2}}]
```



Die Umformung für das obige Beispiel

```
(1 - ((1 - b^2) ^ 2)) ^ 1 // Simplify // Expand
```

$$2b^2 - b^4$$

Minuend (“doppelter” Binomialfilter 2. Ordnung)

```
2 ListConvolve[binom[2], identität[5], 2]
```

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

Subtrahend (Binomialfilter 4. Ordnung)

```
binom[4]
```

$$\left\{\frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16}\right\}$$

Ergebnis gemäß ${}^{(2,1)}B = 2 \cdot {}^2B - {}^4B$

```
2 ListConvolve[binom[2], identität[5], 2] - binom[4]
```

$$\left\{-\frac{1}{16}, \frac{1}{4}, \frac{5}{8}, \frac{1}{4}, -\frac{1}{16}\right\}$$

Dieselben Koeffizienten aus allgemeinem Ansatz: $^{(2,1)}B = I - (I - {}^2B)^2$

```
identität[5] - ListConvolve[identität[5] - ListConvolve[binom[2], identität[5], 2], identität[5] - ListConvolve[binom[2], identität[5], 2], 3]
```

$$\left\{-\frac{1}{16}, \frac{1}{4}, \frac{5}{8}, \frac{1}{4}, -\frac{1}{16}\right\}$$

- Für $n = 1$ folgt $^{(1,1)}B = I - (I - {}^2B)^1 = {}^2B$

Transferfunktion aus Binomialfilter gebildet

```
transferfunktion[binom[2]] // TrigExpand
```

$$\cos[\pi k_1]^2$$

Transferfunktion gemäß Bildungsvorschrift (s.o.)

```
(1 - 1/2^1 (1 - Cos[2 π k1])^1)^1 // Simplify
```

$$\cos[\pi k_1]^2$$

Binomialfilter 2. Ordnung (hier mit 5 Stützstellen)

```
identität[5] - ListConvolve[identität[5], identität[5] - ListConvolve[binom[2], identität[5], 2], 3]
```

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

- die Bildungsvorschrift der Transferfunktion läßt sich für $n = 2$ verifizieren:

Binomialfilter 4. Ordnung aus Faltung des Binomialfilter 2. Ordnung mit sich selbst

```
ListConvolve[ListConvolve[binom[2], identität[5], 2], ListConvolve[binom[2], identität[5], 2], 3]
```

$$\left\{\frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16}\right\}$$

```
binom[4]
```

$$\left\{\frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16}\right\}$$

Transferfunktion ${}^{(2,1)}\hat{\mathbf{B}}$ des Glättungsfilters ${}^{(2,1)}\mathbf{B}$ gebildet aus Filterkoeffizienten gemäß umgeformter Bildungsvorschrift ${}^{(2,1)}\mathbf{B} = 2 \cdot {}^2\mathbf{B} - {}^4\mathbf{B}$

```
transferfunktion[2 ListConvolve[binom[2], identität[5], 2] - binom[4]]
```

$$-\frac{1}{2} \cos[\pi k_1]^2 (-3 + \cos[2\pi k_1])$$

Transferfunktion ${}^{(2,1)}\hat{\mathbf{B}}$ des Glättungsfilters ${}^{(2,1)}\mathbf{B}$ gebildet der gewichteten Differenz der Transferfunktionen ${}^{(2,1)}\hat{\mathbf{B}} = 2 \cdot {}^2\hat{\mathbf{B}} - {}^4\hat{\mathbf{B}}$

```
2 transferfunktion[binom[2]] - transferfunktion[binom[4]]
```

$$2 \cos[\pi k_1]^2 - \cos[\pi k_1]^4$$

```
2 transferfunktion[binom[2]] - transferfunktion[binom[4]] // TrigFactor
```

$$-\frac{1}{2} \cos[\pi k_1]^2 (-3 + \cos[2\pi k_1])$$

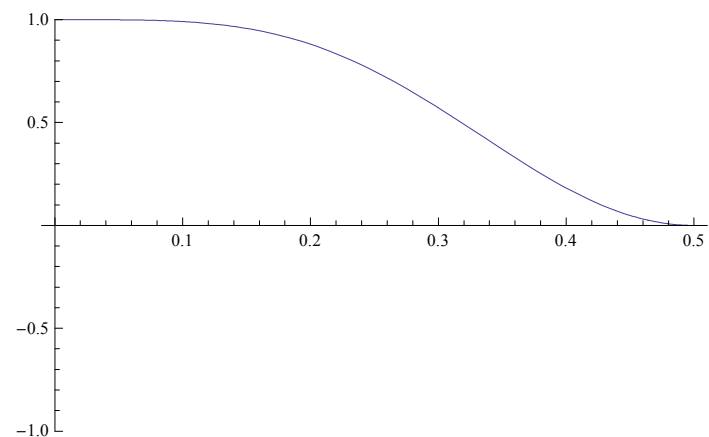
Transferfunktion ${}^{(2,1)}\hat{\mathbf{B}}$ des Glättungsfilters ${}^{(2,1)}\mathbf{B}$ direkt gebildet aus ${}^{(n,l)}\hat{\mathbf{B}} = \left\{1 - \frac{1}{2^n} [1 - \cos(2\pi k)]^n\right\}^l$

```
(1 - 1 / 2^2 (1 - Cos[2 π k_1])^2)^1 // TrigFactor
```

$$-\frac{1}{2} \cos[\pi k_1]^2 (-3 + \cos[2\pi k_1])$$

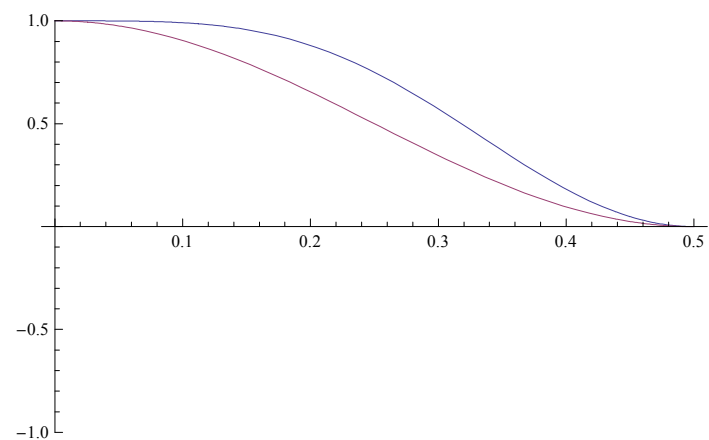
Plot der Transferfunktion ${}^{(2,1)}\hat{B}$ für ${}^{(2,1)}B = I - (I - {}^2B)^2 = 2 \cdot {}^2B - {}^4B$

```
Plot[Evaluate@transferfunktion[2 ListConvolve[binom[2], identität[5], 2] - binom[4]], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



zum Vergleich ${}^2\hat{B}$ des Binomialfilters 2B

```
Plot[Evaluate@{transferfunktion[2 ListConvolve[binom[2], identität[5], 2] - binom[4]], transferfunktion[binom[2]]}, {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



- Für $n = 1$ und $l > 1$ ergeben sich einfache Binomialfilter 2 l . Ordnung:

Für $n = 1$ und $l = 2$ folgt $^{(1,2)}\mathbf{B} = [\mathbf{I} - (\mathbf{I} - \mathbf{B})^2]^2 = \mathbf{B}^2 = \mathbf{B}$

```
(1 - ((1 - b^2) ^1)) ^2 // Simplify // Expand
```

b^4

```
ListConvolve[identität[5] - ListConvolve[identität[5], identität[5] - ListConvolve[binom[2], identität[5], 2], 3],
  identität[5] - ListConvolve[identität[5], identität[5] - ListConvolve[binom[2], identität[5], 2], 3], 3]
```

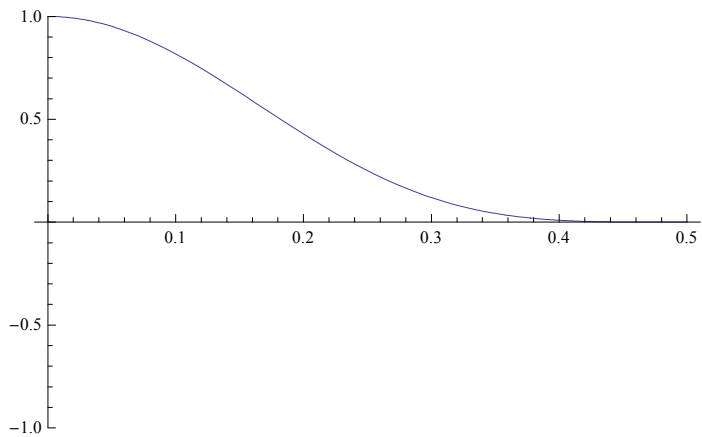
$\left\{ \frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16} \right\}$

```
binom[4]
```

$\left\{ \frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16} \right\}$

Transferfunktion von $^{(1,2)}\hat{\mathbf{B}} = \hat{\mathbf{B}}$

```
Plot[Evaluate@transferfunktion[binom[4]], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



- Für $n \geq 1$ und $l \geq 1$ ergeben sich viele Varianten, z.B. mit $n = 2$ und $l = 2$ folgt $^{(2,2)}\mathbf{B} = \left[\mathbf{I} - (\mathbf{I} - \mathbf{B})^2 \right]^2 = \left[2 \cdot \mathbf{B} - \mathbf{B}^2 \right]^2$

Differenz aus Identitätsoperator und Binomialfilter 2. Ordnung (hier mit 9 Stützstellen)

`identität[9] - ListConvolve[binom[2], identität[9], 2]`

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

Differenz aus Identitätsoperator und o.g. quadrierter Differenz aus Identitätsoperator und Binomialfilter 2. Ordnung

`identität[9] - ListConvolve[identität[9] - ListConvolve[binom[2], identität[9], 2], identität[9] - ListConvolve[binom[2], identität[9], 2], 5]`

$$\left\{ 0, 0, -\frac{1}{16}, \frac{1}{4}, \frac{5}{8}, \frac{1}{4}, -\frac{1}{16}, 0, 0 \right\}$$

Glättungsfilter $^{(2,2)}\mathbf{B} = \left[\mathbf{I} - (\mathbf{I} - \mathbf{B})^2 \right]^2$ aus Quadrat (Faltung mit sich selbst) vorgenannter Differenz:

`ListConvolve[identität[9] - ListConvolve[identität[9] - ListConvolve[binom[2], identität[9], 2],`

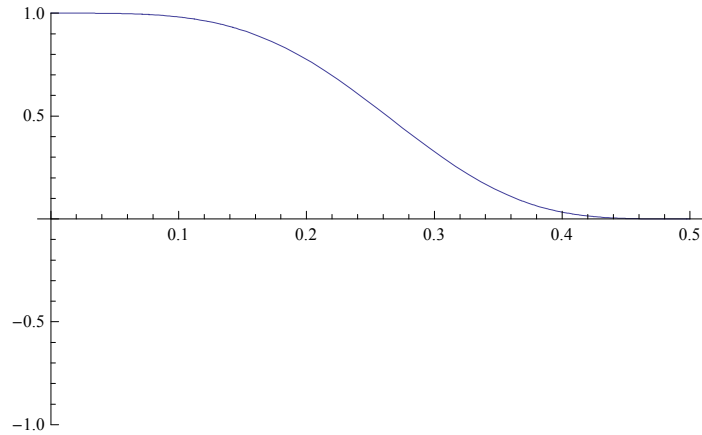
`identität[9] - ListConvolve[binom[2], identität[9], 2], 5], identität[9] -`

`ListConvolve[identität[9] - ListConvolve[binom[2], identität[9], 2], identität[9] - ListConvolve[binom[2], identität[9], 2], 5], 5]`

$$\left\{ \frac{1}{256}, -\frac{1}{32}, -\frac{1}{64}, \frac{9}{32}, \frac{67}{128}, \frac{9}{32}, -\frac{1}{64}, -\frac{1}{32}, \frac{1}{256} \right\}$$

Transferfunktion des Glättungsfilters $\hat{B}^{(2,2)}$

```
Plot[Evaluate@transferfunktion[ListConvolve[identität[9] -
  ListConvolve[identität[9] - ListConvolve[binom[2], identität[9], 2], identität[9] - ListConvolve[binom[2], identität[9], 2], 5],
  identität[9] - ListConvolve[identität[9] - ListConvolve[binom[2], identität[9], 2],
  identität[9] - ListConvolve[binom[2], identität[9], 2], 5], 5]], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



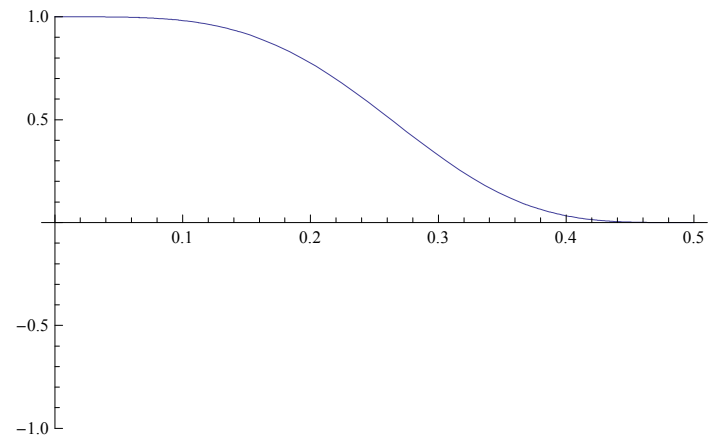
```
transferfunktion[ListConvolve[identität[9] - ListConvolve[
  identität[9] - ListConvolve[binom[2], identität[9], 2], identität[9] - ListConvolve[binom[2], identität[9], 2], 5], identität[9] -
  ListConvolve[identität[9] - ListConvolve[binom[2], identität[9], 2], identität[9] - ListConvolve[binom[2], identität[9], 2], 5], 5]]
```

$$\frac{1}{4} \cos[\pi k_1]^4 (-3 + \cos[2 \pi k_1])^2$$

dieselbe Transferfunktion des Glättungsfilters $\hat{B}^{(2,2)}$ gemäß der Bildungsvorschrift

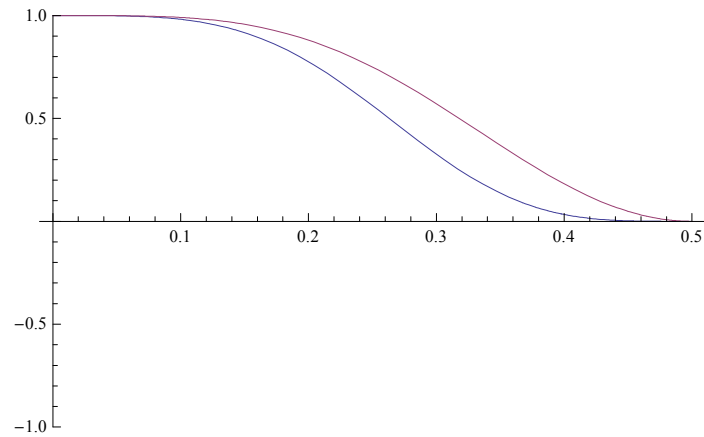
```
n = 2;
l = 2;
(1 - 1 / 2^n (1 - Cos[2 π k1]) ^ n) ^ 1 // TrigFactor
Plot[(1 - 1 / 2^n (1 - Cos[2 π k1]) ^ n) ^ 1, {k1, 0, kmax}, PlotRange -> {Full, {-1, 1}}]
```

$$\frac{1}{4} \cos[\pi k_1]^4 (-3 + \cos[2 \pi k_1])^2$$



zum Vergleich die Transferfunktion des o.g. Glättungsfilters $^{(2,1)}\hat{B}$

```
Plot[Evaluate@{(1 - 1/2^n (1 - Cos[2 π k1])^n)^1, transferfunktion[2 ListConvolve[binom[2], identität[5], 2] - binom[4]]},
{k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```

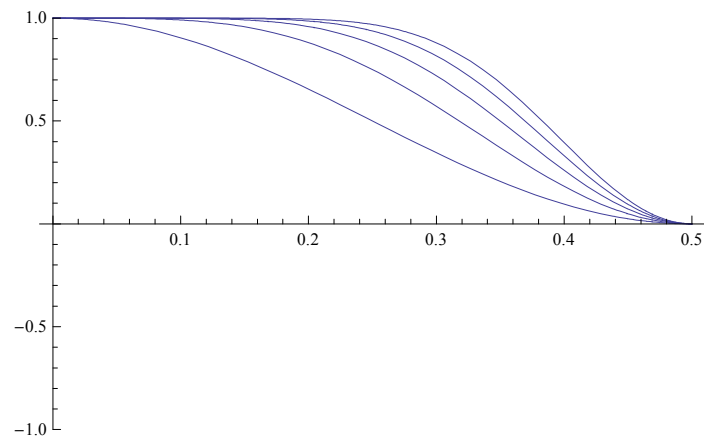


Transferfunktionen $^{(1,1)}\hat{B} = ^{(2,1)}\hat{B}$, $^{(2,1)}\hat{B}$, $^{(3,1)}\hat{B}$, $^{(4,1)}\hat{B}$, $^{(5,1)}\hat{B}$

```
Table[(1 - 1/2^n (1 - Cos[2 π k1])^n)^1, {n, 1, 5}, {1, 1, 1}]
```

$$\left\{ \left\{ 1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right\}, \left\{ 1 - \frac{1}{4} (1 - \cos[2 \pi k_1])^2 \right\}, \left\{ 1 - \frac{1}{8} (1 - \cos[2 \pi k_1])^3 \right\}, \left\{ 1 - \frac{1}{16} (1 - \cos[2 \pi k_1])^4 \right\}, \left\{ 1 - \frac{1}{32} (1 - \cos[2 \pi k_1])^5 \right\} \right\}$$

```
Plot[Table[(1 - 1/2^n (1 - Cos[2 π k1])^n)^1, {n, 1, 5}, {1, 1, 1}], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```

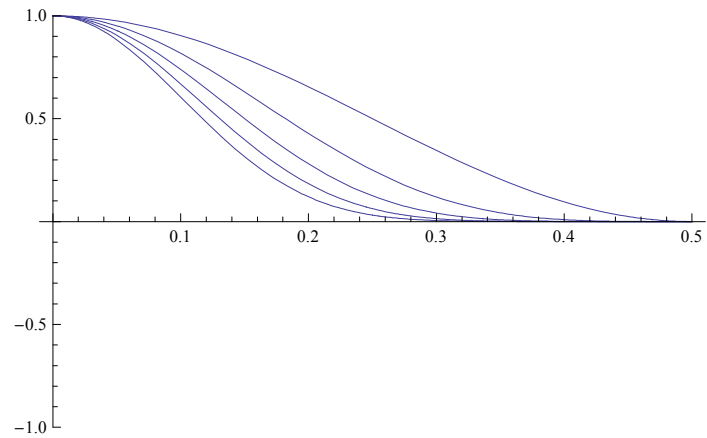


Transferfunktionen $^{(1,1)}\hat{B} = {}^2\hat{B}$, $^{(1,2)}\hat{B} = {}^4\hat{B}$, $^{(1,3)}\hat{B} = {}^6\hat{B}$, $^{(1,4)}\hat{B} = {}^8\hat{B}$, $^{(1,5)}\hat{B} = {}^{10}\hat{B}$

```
Table[(1 - 1/2^n (1 - Cos[2 π k1]))^n, {n, 1, 1}, {1, 1, 5}]
```

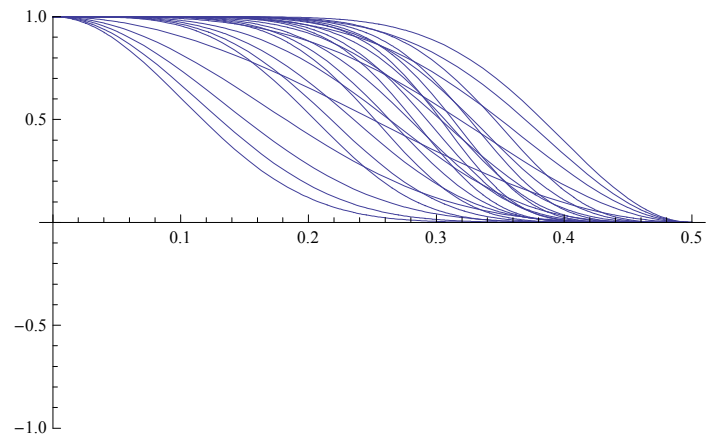
$$\left\{ \left\{ 1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right\}, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^2, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^3, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^4, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^5 \right\}$$

```
Plot[Table[(1 - 1/2^n (1 - Cos[2 π k1]))^n, {n, 1, 1}, {1, 1, 5}], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



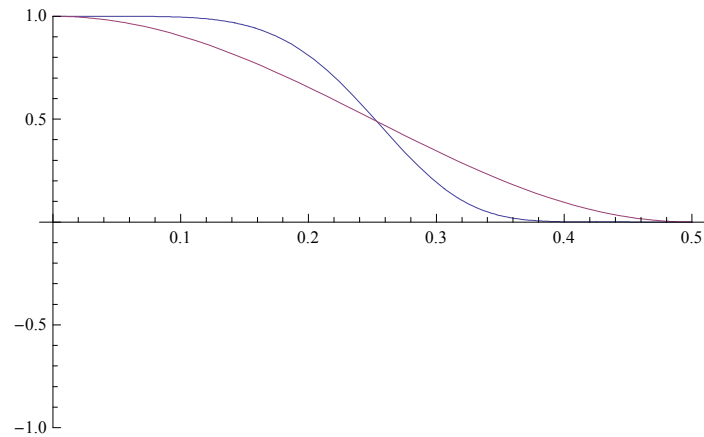
Transferfunktionen $^{(1,1)}\hat{B} = {}^2\hat{B}$ bis $^{(5,5)}\hat{B}$

```
Plot[Table[(1 - 1/2^n (1 - Cos[2 π k1]))^n, {n, 1, 5}, {1, 1, 5}], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



Transferfunktionen $^{(1,1)}\hat{B} = {}^2\hat{B}$ und $^{(3,5)}\hat{B}$

```
Plot[{(1 - 1/2^3 (1 - Cos[2 π k1])^3)^5, (1 - 1/2^1 (1 - Cos[2 π k1])^1)^1}, {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



extreme Transferfunktionen $^{(50,1)}\hat{B}$, $^{(100,1)}\hat{B}$, $^{(150,1)}\hat{B}$, $^{(200,1)}\hat{B}$, $^{(250,1)}\hat{B}$

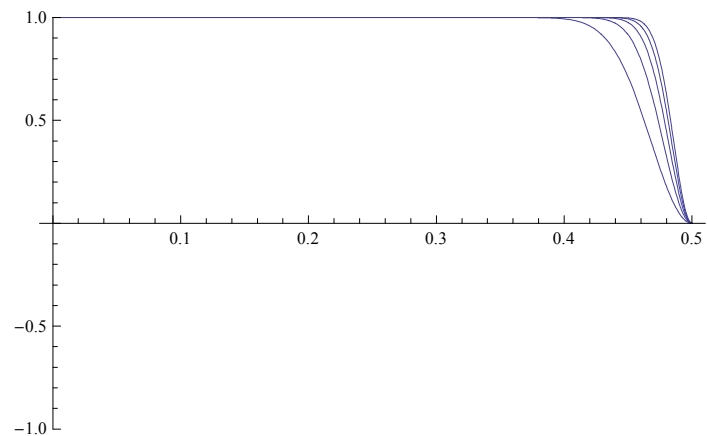
```
Table[(1 - 1/2^n (1 - Cos[2 π k1])^n)^1, {n, 50, 250, 50}, {1, 1, 1}]
```

$$\left\{ \left\{ 1 - \frac{(1 - \cos[2 \pi k_1])^{50}}{1125899906842624} \right\}, \left\{ 1 - \frac{(1 - \cos[2 \pi k_1])^{100}}{1267650600228229401496703205376} \right\}, \right.$$

$$\left\{ 1 - \frac{(1 - \cos[2 \pi k_1])^{150}}{1427247692705959881058285969449495136382746624} \right\}, \left\{ 1 - \frac{(1 - \cos[2 \pi k_1])^{200}}{1606938044258990275541962092341162602522202993782792835301376} \right\},$$

$$\left. \left\{ 1 - \frac{(1 - \cos[2 \pi k_1])^{250}}{1809251394333065553493296640760748560207343510400633813116524750123642650624} \right\} \right\}$$

```
Plot[Table[(1 - 1/2^n (1 - Cos[2 π k1]))^n]^1, {n, 50, 250, 50}, {1, 1, 1}], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```

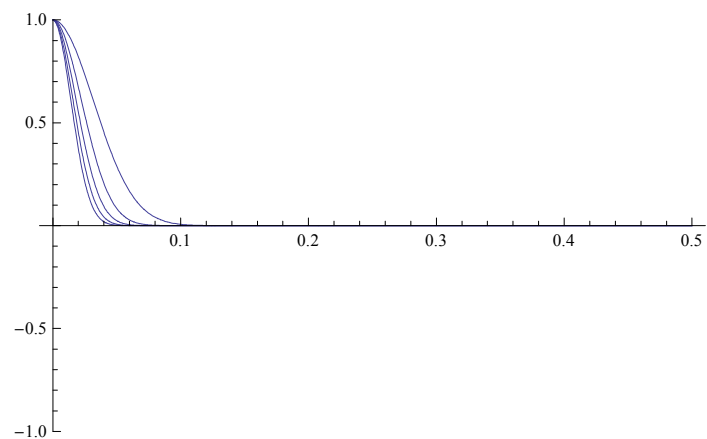


extreme Transferfunktionen $^{(1,50)} \hat{B} =^{100} \hat{B}, ^{(1,100)} \hat{B} =^{200} \hat{B}, ^{(1,150)} \hat{B} =^{300} \hat{B}, ^{(1,200)} \hat{B} =^{400} \hat{B}, ^{(1,250)} \hat{B} =^{500} \hat{B}$

```
Table[(1 - 1/2^n (1 - Cos[2 π k1]))^n]^1, {n, 1, 1}, {1, 50, 250, 50}]
```

$$\left\{ \left\{ \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^{50}, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^{100}, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^{150}, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^{200}, \left(1 + \frac{1}{2} (-1 + \cos[2 \pi k_1]) \right)^{250} \right\} \right\}$$

```
Plot[Table[(1 - 1/2^n (1 - Cos[2 π k1]))^n]^1, {n, 1, 1}, {1, 50, 250, 50}], {k1, 0, kmax}, PlotRange → {Full, {-1, 1}}]
```



14. Nichtlineare Filter

Medianfilter

Nutzen: Beseitigung singulärer Bildfehler oder störender kleiner Details

Pixelumgebung durch Strukturelement definiert

“Rangordnungsfilter”: immer das in der Sortierreihenfolge mittlere Element aus Pixelumgebung wird dem Pixel neu zugewiesen

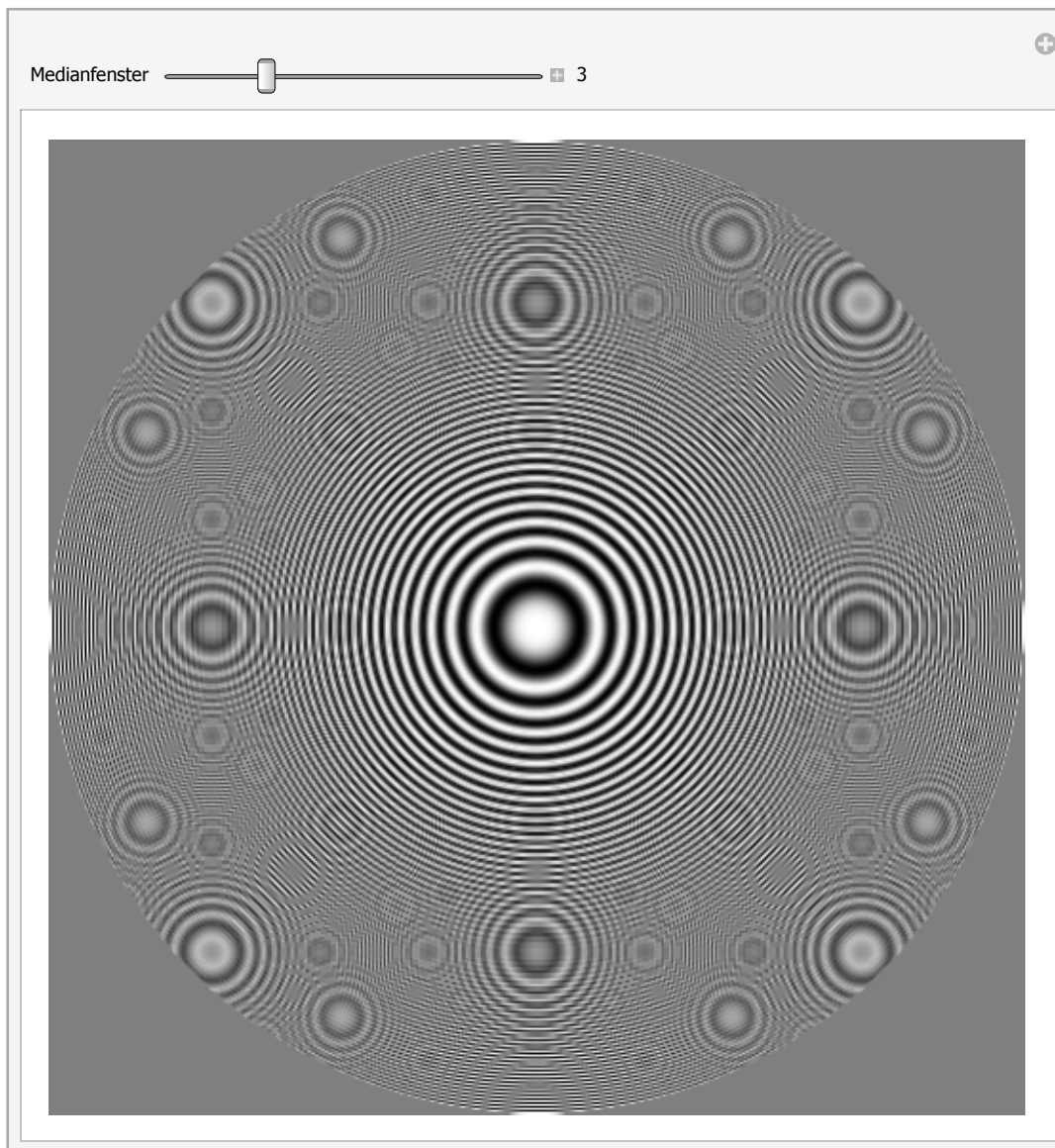
```
Clear[boxmaske];
boxmaske[r_] := Table[1, {2 r + 1}, {2 r + 1}];
```

```
MatrixForm[boxmaske[10]]
```

[illegible]

Medianfilter: Boxmaske

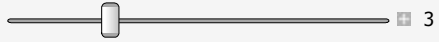
```
Manipulate[Show[Image[Partition[Map[Median[Flatten[#]] &, Flatten[Partition[#, {größe, größe}, {1, 1},
  {{(größe + 1) / 2, (größe + 1) / 2}, {(größe + 1) / 2, (größe + 1) / 2}}], 1]], Dimensions[#][[2]]], ImageSize → Dimensions[#]]],
  {{größe, 3, "Medianfenster"}, 1, 9, 2, Appearance → "Labeled"}, ContinuousAction → False, SaveDefinitions → True] &[ImageData[wellenbild]]
```



Medianfilter mit quadratischem Strukturelement, eigene Lösung 1

```
Manipulate[Show[Image[Partition[Map[Median[Flatten[#]] &, Flatten[Partition[#, {größe, größe}, {1, 1},
    {{(größe + 1) / 2, (größe + 1) / 2}, {(größe + 1) / 2, (größe + 1) / 2}}], 1]], Dimensions[#][[2]]], ImageSize → Dimensions[#]]],
    {{größe, 3, "Medianfenster"}, 1, 9, 2, Appearance → "Labeled"}, ContinuousAction → False, SaveDefinitions → True] &[
    Map[{0.299, 0.587, 0.114}.# &, ImageData[ExampleData[{"TestImage", "Lena"}]], {2}]]
```

Medianfenster

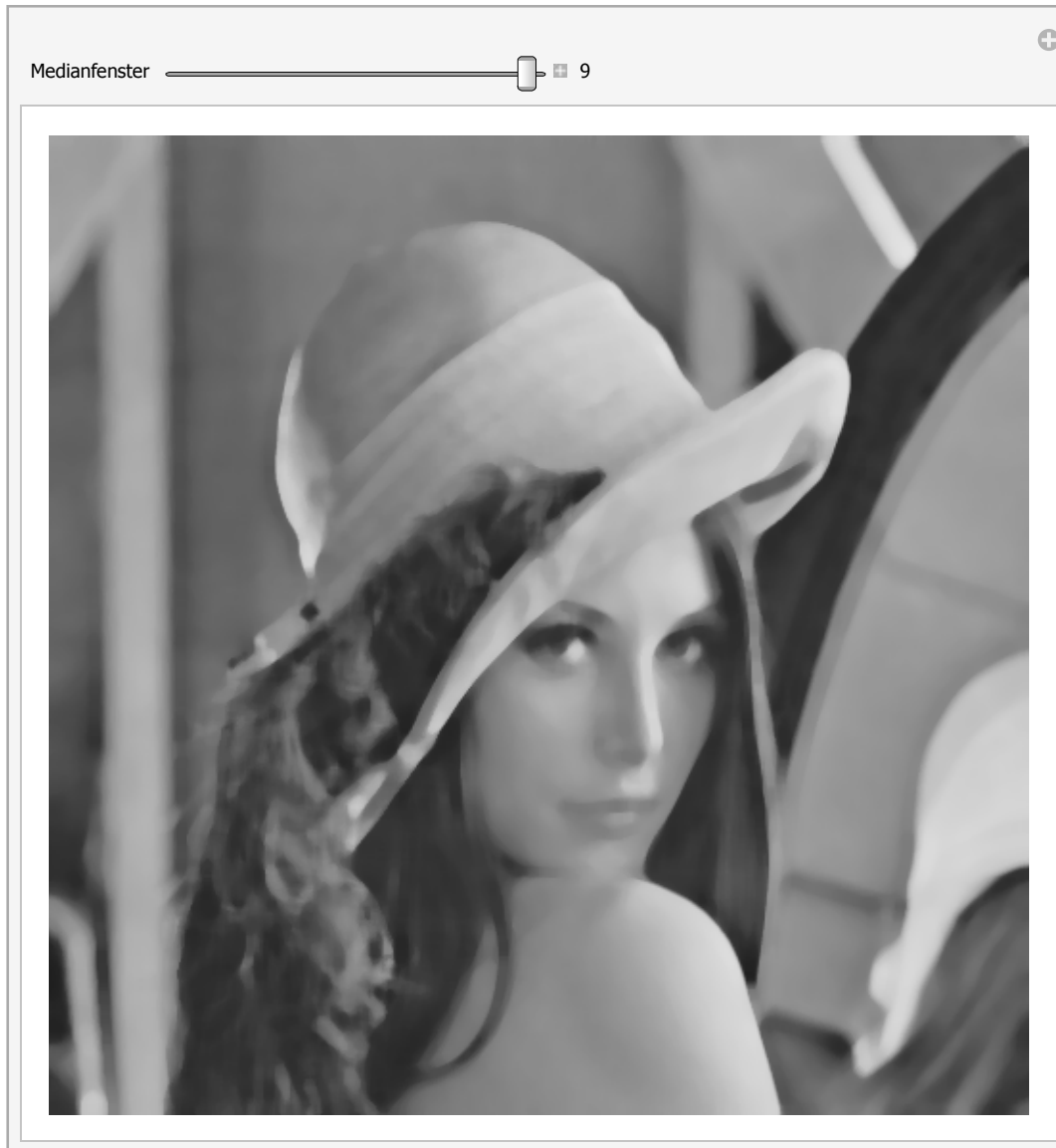


3

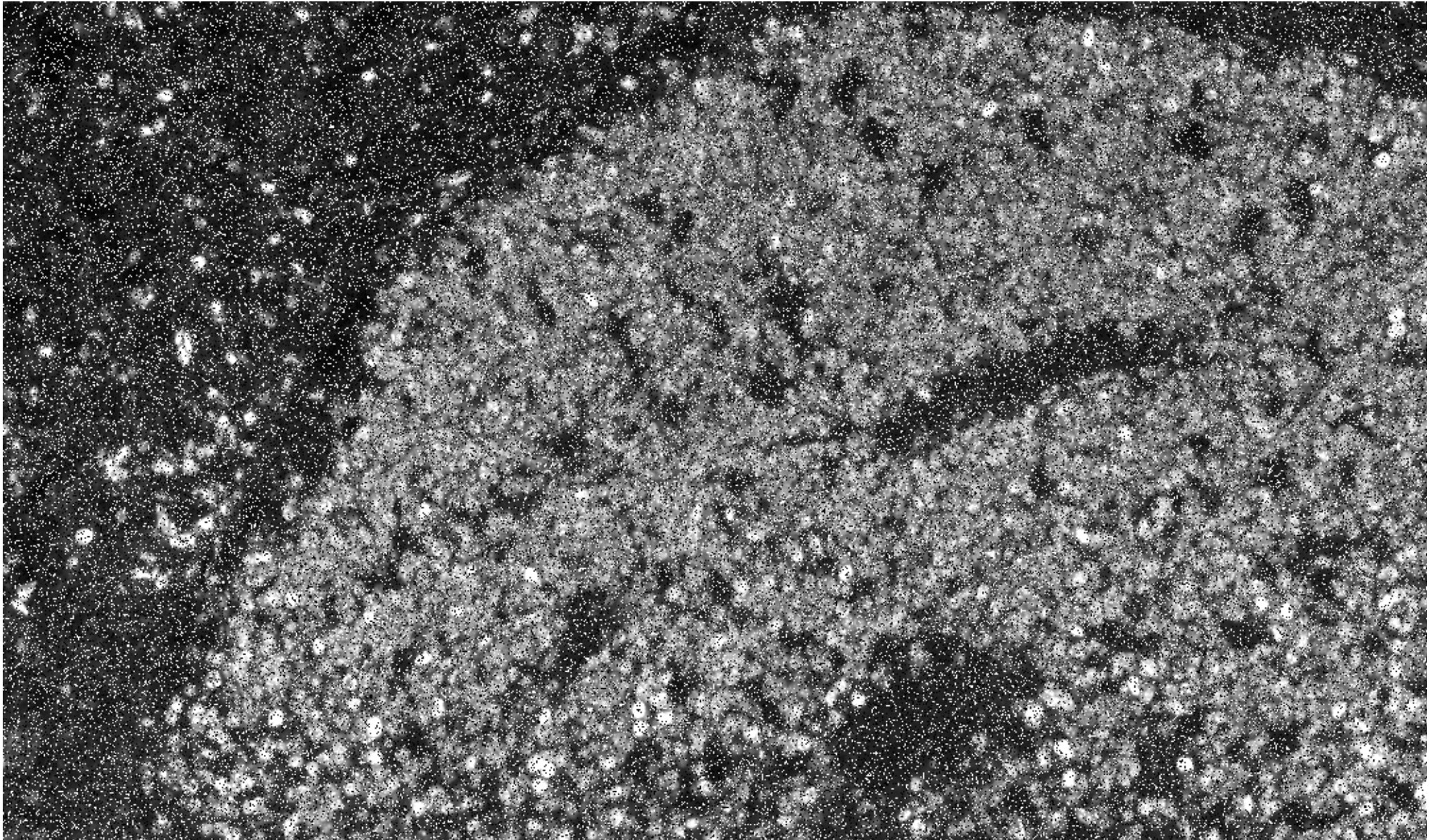


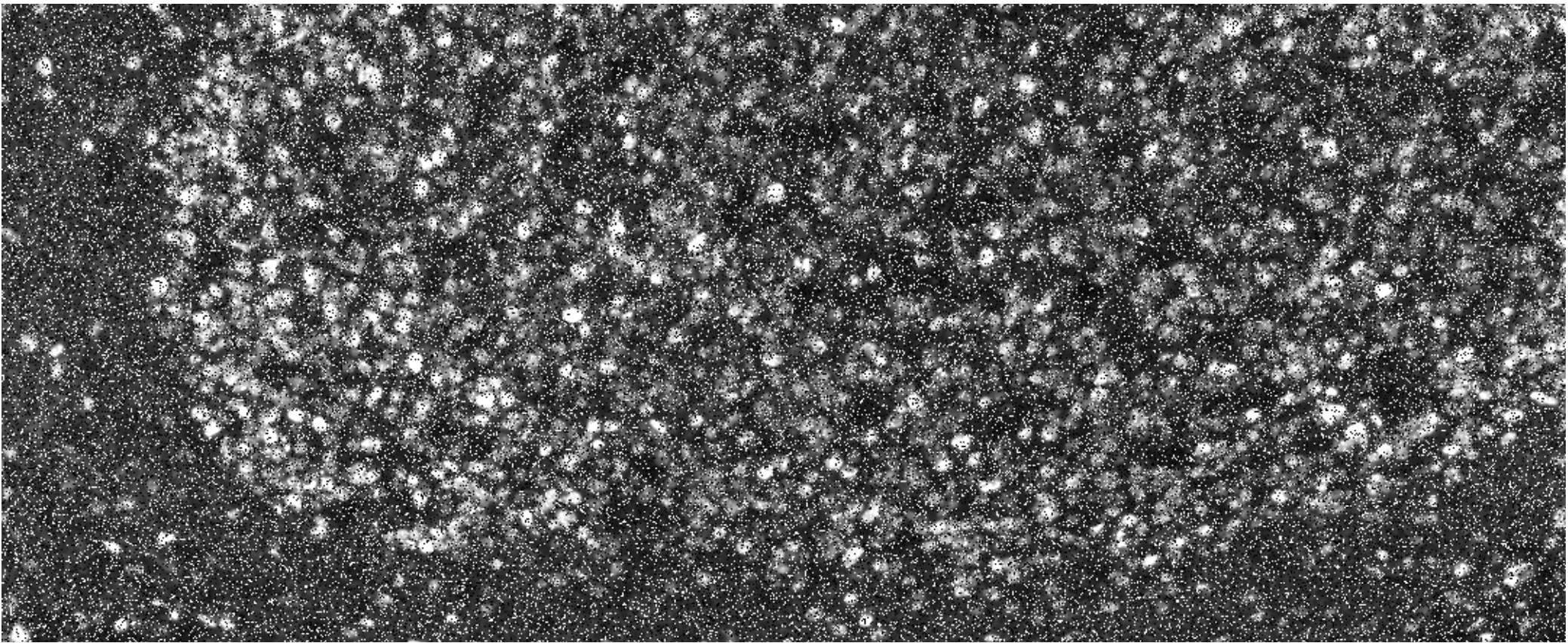
Medianfilter mit quadratischem Strukturelement, eingebaute Lösung

```
Manipulate[Show[MedianFilter[#, (größe - 1) / 2]], {{größe, 3, "Medianfenster"}, 1, 9, 2, Appearance -> "Labeled"},  
  ContinuousAction -> False, SaveDefinitions -> True] &[ImageApply[{0.299, 0.587, 0.114}.# &, ExampleData[{"TestImage", "Lena"}]]]
```



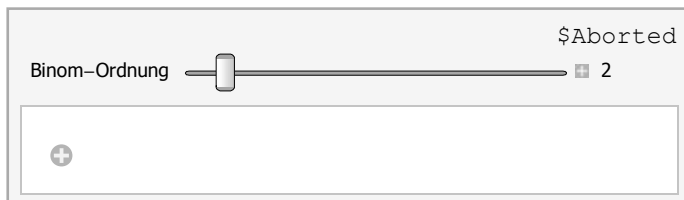
```
SeedRandom[2405];  
defektesbild =  
  Image[Map[If[RandomReal[] < 0.2, If[RandomReal[] ≤ 0.5, 0, 1], #] &, ImageData[First@ColorSeparate[Ton3CD21dreikanalausgleichF2]], {2}]];  
Show[defektesbild, ImageSize → ImageDimensions@defektesbild]
```





Mit linearem Glättungsfilter kriegt man diese Art von Rauschen nicht weg:

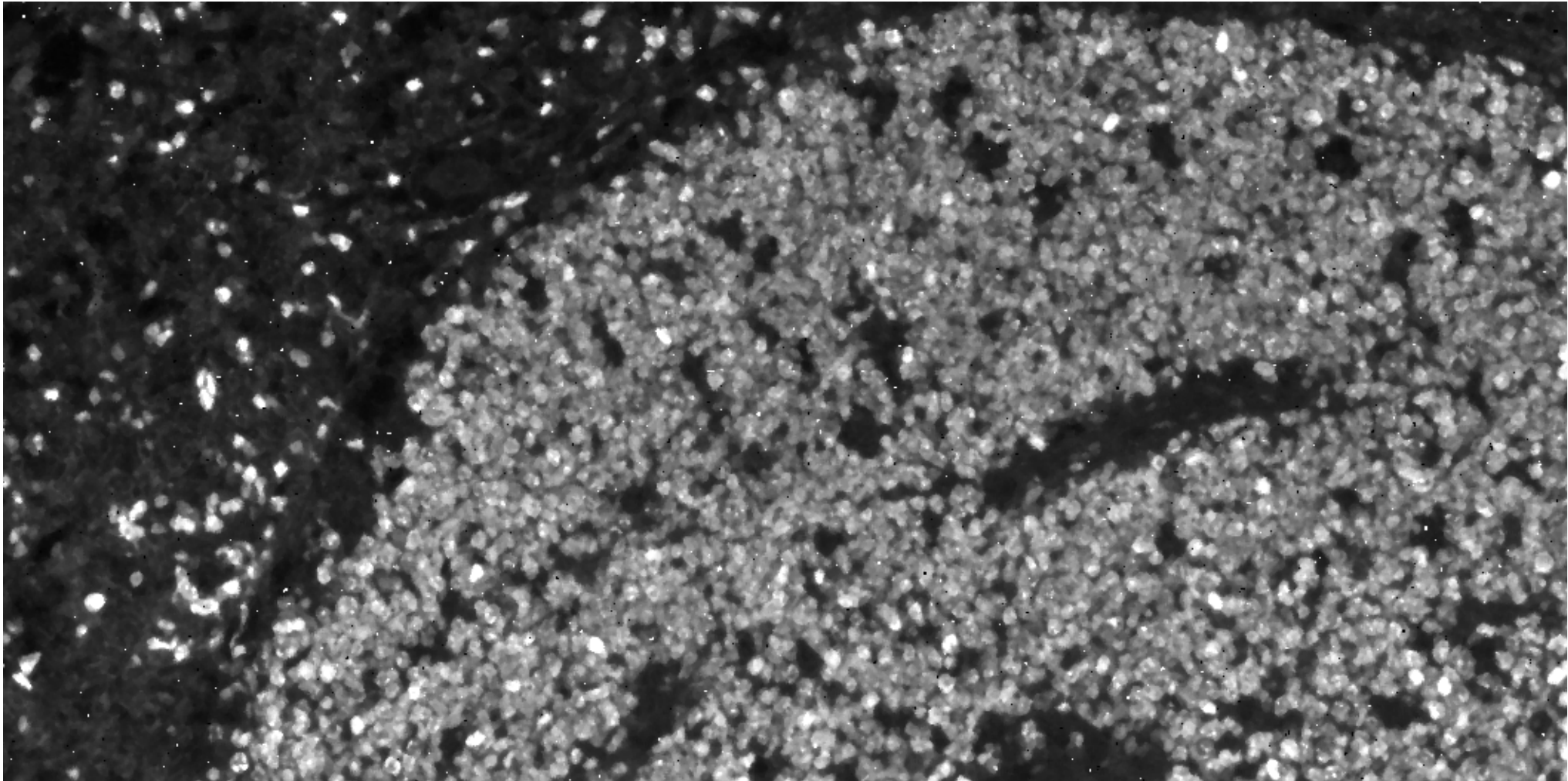
```
Manipulate[Show[ImageConvolve[defektesbild, Transpose[{binom[ordnung]}].{binom[ordnung]}], ImageSize → ImageDimensions@defektesbild],
{{ordnung, 2, "Binom-Ordnung"}, 0, 30, 2, Appearance → "Labeled"}, ContinuousAction → False, SaveDefinitions → True]
```

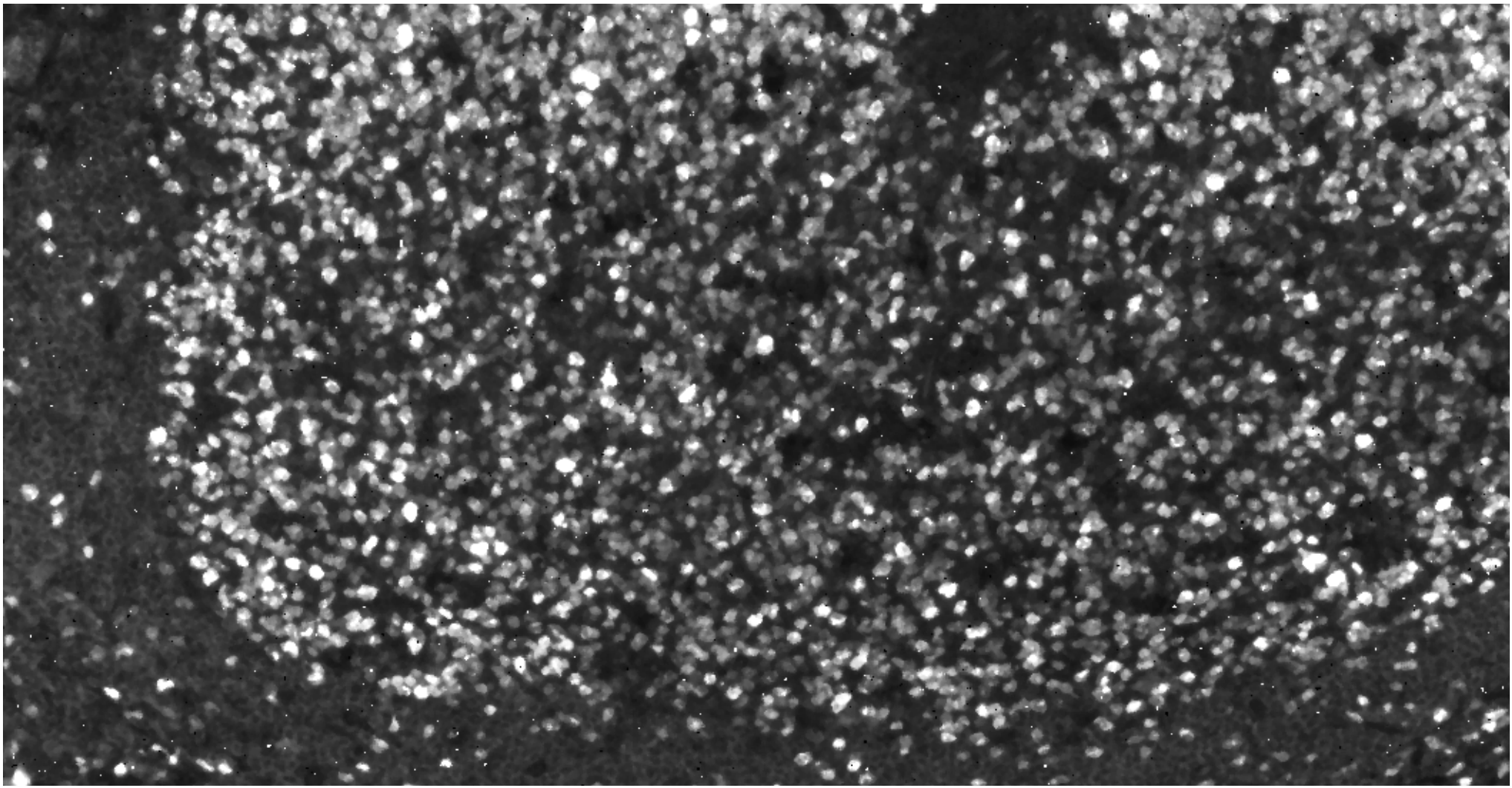


Medianfilter mit quadratischem Strukturelement, eigene Lösung 1 wie oben

```
Manipulate[Show[Image[Partition[Map[Median[Flatten[#]] &,
  Flatten[Partition[#, {größe, größe}, {1, 1}, {{(größe + 1) / 2, (größe + 1) / 2}, {(größe + 1) / 2, (größe + 1) / 2}}], 1]],
  Dimensions[#][[2]]], ImageSize → Reverse@Dimensions[#]], {{größe, 3, "Medianfenster"}, 1, 9, 2,
  Appearance → "Labeled"}, ContinuousAction → False, SaveDefinitions → True] &[ImageData[defektesbild]]
```

Medianfenster

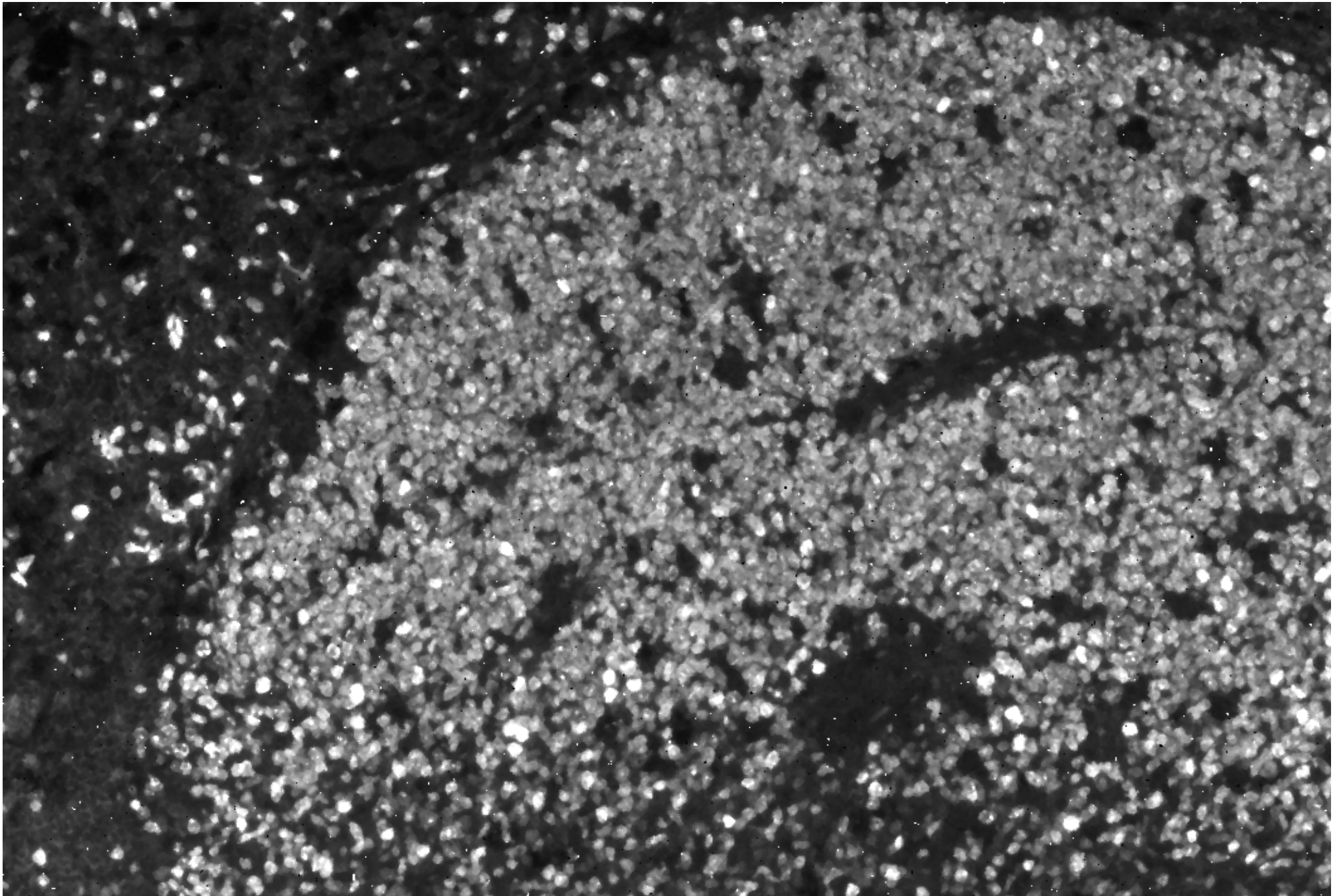


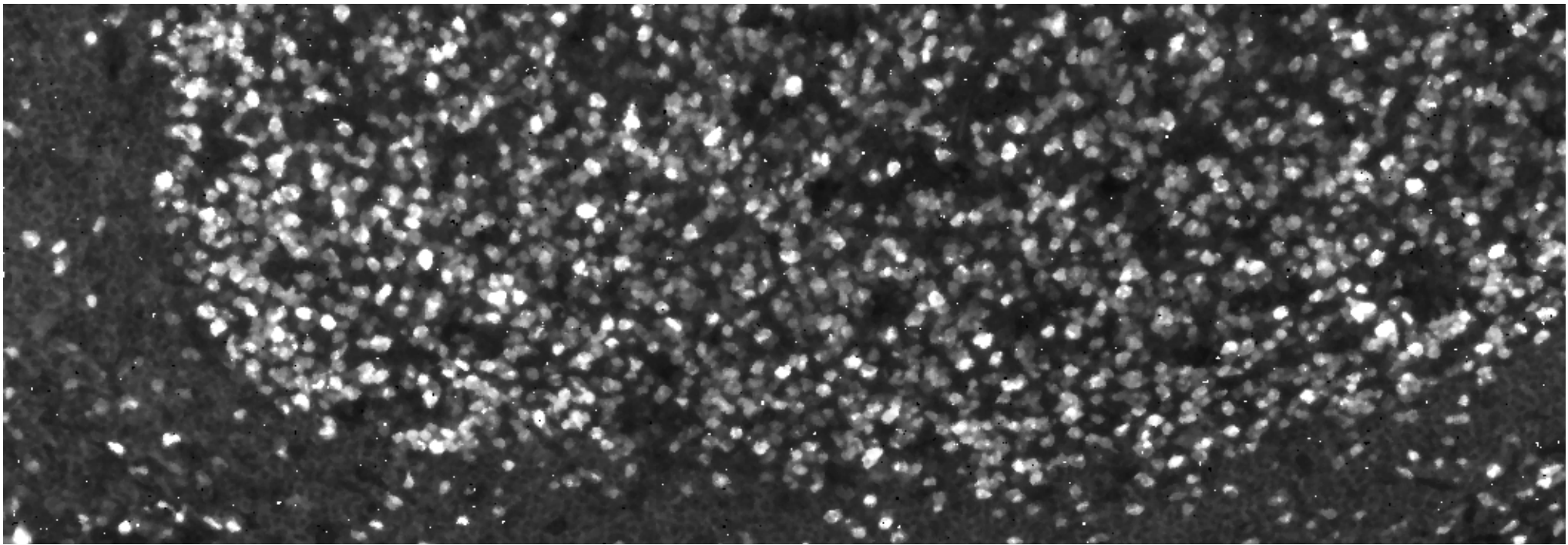


Medianfilter mit quadratischem Strukturelement, eingebaute Lösung wie oben

```
Manipulate[Show[MedianFilter[#, (größe - 1) / 2]],
  {{größe, 3, "Medianfenster"}, 1, 9, 2, Appearance -> "Labeled"}, ContinuousAction -> False, SaveDefinitions -> True] &[defektesbild]
```

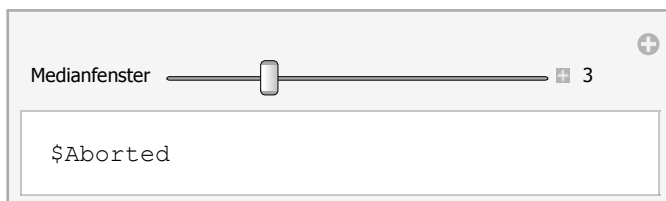
Medianfenster





Medianfilter mit quadratischem (links) und kreisförmigem (rechts) Strukturelement , eigene Lösung 2

```
Manipulate[
  ControlActive[größe, Grid[{{Show[Image[MyMedianFilter[#1, boxmaske[(größe - 1) / 2]], "Byte"], ImageSize → Reverse@Dimensions[#1]],
    Show[Image[MyMedianFilter[#1, kreismaske[(größe - 1) / 2]], "Byte"], ImageSize → Reverse@Dimensions[#1]]}}]],
  {{größe, 3, "Medianfenster"}, 1, 9, 2, Appearance → "Labeled"}, ContinuousAction → False,
  SaveDefinitions → True] &[ImageData[wellenbild, "Byte"]]
```



Maximumfilter

“Rangordnungsfilter”: immer das in der aufsteigenden Sortierreihenfolge letzte Element aus Pixelumgebung wird dem Pixel neu zugewiesen

```
Clear[GrayDilate];
(*GrayDilate[im_,el_] := ListConvolve[el,im,{Ceiling[Dimensions[el]/2]},im,Times,Max];*)
GrayDilate = Compile[{{im,_Integer,2},{el,_Integer,2}},ListConvolve[el,im,{Ceiling[Dimensions[el]/2]},im,Times,Max],
  CompilationTarget->"WVM",RuntimeAttributes->{Listable},Parallelization->True];

SeedRandom[2405];
in = Developer`ToPackedArray[ArrayPad[RandomInteger[{0,255},{5,7}],{1,1}]];
out = GrayDilate[in,kreismaske[1]];
{MatrixForm[in],MatrixForm[kreismaske[1]],MatrixForm[out]}
```

$$\left\{ \begin{pmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 201 & 57 & 106 & 243 & 47 & 8 & 5 & 0 \\ 0 & 72 & 136 & 155 & 251 & 195 & 218 & 244 & 0 \\ 0 & 110 & 196 & 248 & 99 & 132 & 237 & 98 & 0 \\ 0 & 20 & 191 & 118 & 6 & 68 & 16 & 243 & 0 \\ 0 & 238 & 169 & 98 & 169 & 16 & 112 & 112 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix}, \begin{pmatrix} 0 & 1 & 0 \\ 1 & 1 & 1 \\ 0 & 1 & 0 \end{pmatrix}, \begin{pmatrix} 0 & 201 & 57 & 106 & 243 & 47 & 8 & 5 & 0 \\ 201 & 201 & 201 & 243 & 251 & 243 & 218 & 244 & 5 \\ 72 & 201 & 196 & 251 & 251 & 251 & 244 & 244 & 244 \\ 110 & 196 & 248 & 248 & 251 & 237 & 237 & 244 & 98 \\ 20 & 238 & 196 & 248 & 169 & 132 & 243 & 243 & 243 \\ 238 & 238 & 238 & 169 & 169 & 169 & 112 & 243 & 112 \\ 0 & 238 & 169 & 98 & 169 & 16 & 112 & 112 & 0 \end{pmatrix} \right\}$$

Maximumfilter mit kreisförmigem Strukturelement

```
Manipulate[ControlActive[größe, Show[Image[GrayDilate[#1, kreismaske[(größe - 1) / 2]], "Byte"], ImageSize -> Reverse@Dimensions[#1]]],
  {{größe, 3, "Maximumfenster"}, 1, 9, 2, Appearance -> "Labeled"}, ContinuousAction -> False, SaveDefinitions -> True] &[
  ImageData[First@ColorSeparate[Ton3CD21dreikanalausgleichF2], "Byte"]]
```



Minimumfilter

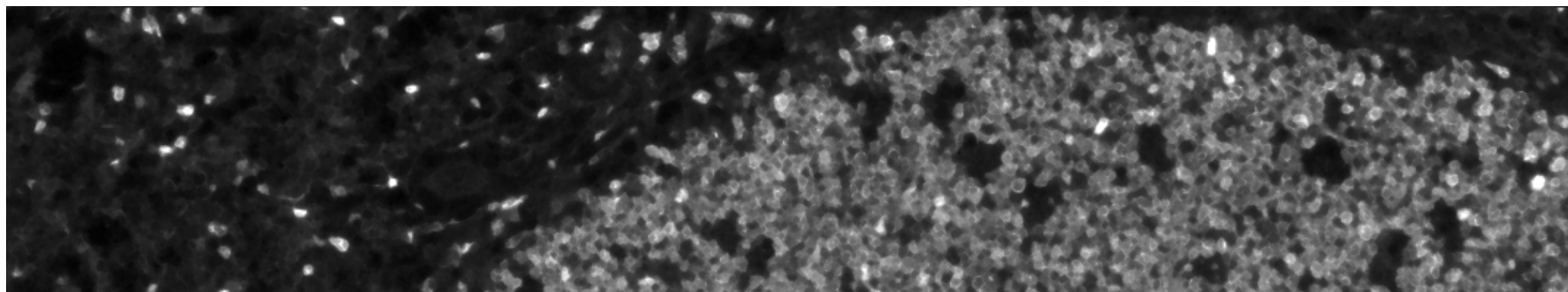
“Rangordnungsfilter”: immer das in der aufsteigenden Sortierreihenfolge erste Element aus Pixelumgebung wird dem Pixel neu zugewiesen

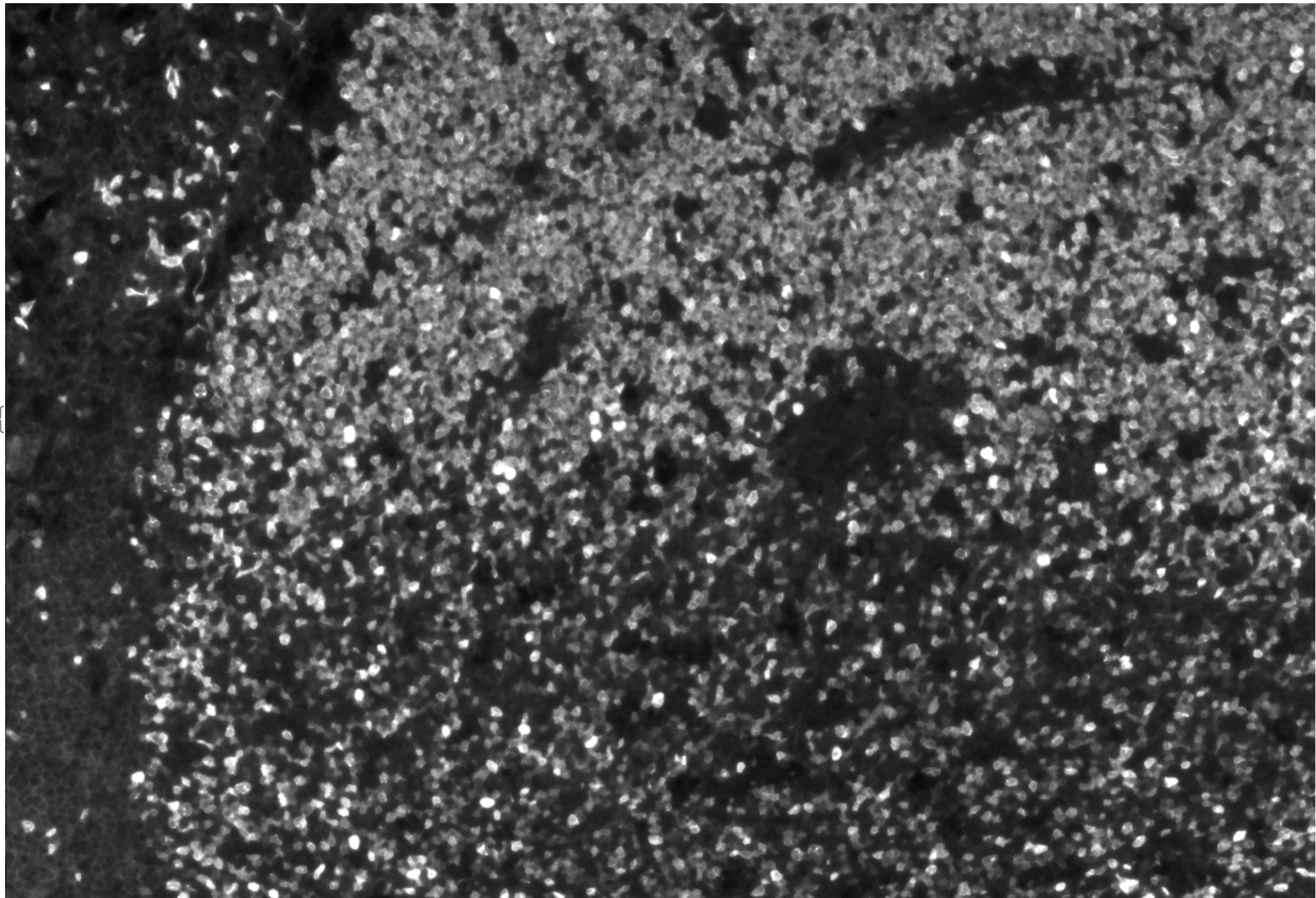
```
Clear[GrayErode];
(*GrayErode[im_,el_]:=
Module[{implus1=im+1},ListConvolve[el,implus1,{Ceiling[Dimensions[el]/2]},implus1,Times,Min[Cases[{{##},Except[0]]]&]-1];*)
(*GrayErode[im_,el_]:=Module[{negim=255-im},255-ListConvolve[el,negim,{Ceiling[Dimensions[el]/2]},negim,Times,Max]];*)
GrayErode = Compile[{{im,_Integer,2},{el,_Integer,2}},
Module[{negim = 255 - im}, 255 - ListConvolve[el, negim, {Ceiling[Dimensions[el] / 2]}, negim, Times, Max]],
CompilationTarget -> "WVM", RuntimeAttributes -> {Listable}, Parallelization -> True];

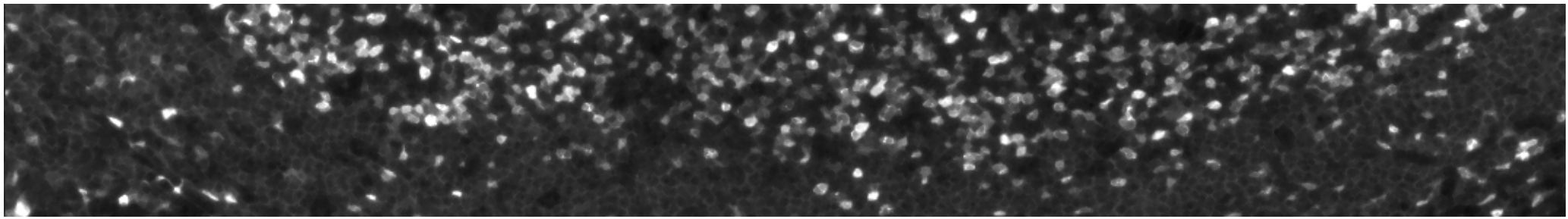
SeedRandom[2405];
in = Developer`ToPackedArray[ArrayPad[RandomInteger[{0, 255}, {5, 7}], {1, 1}]];
out = GrayErode[in, kreismaske[1]];
{MatrixForm[in], MatrixForm[kreismaske[1]], MatrixForm[out]}
```

$$\left\{ \begin{pmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 201 & 57 & 106 & 243 & 47 & 8 & 5 & 0 \\ 0 & 72 & 136 & 155 & 251 & 195 & 218 & 244 & 0 \\ 0 & 110 & 196 & 248 & 99 & 132 & 237 & 98 & 0 \\ 0 & 20 & 191 & 118 & 6 & 68 & 16 & 243 & 0 \\ 0 & 238 & 169 & 98 & 169 & 16 & 112 & 112 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix}, \begin{pmatrix} 0 & 1 & 0 \\ 1 & 1 & 1 \\ 0 & 1 & 0 \end{pmatrix}, \begin{pmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 57 & 106 & 99 & 47 & 8 & 0 & 0 \\ 0 & 0 & 110 & 99 & 6 & 68 & 16 & 0 & 0 \\ 0 & 0 & 20 & 6 & 6 & 6 & 16 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix} \right\}$$

```
Map[Show[Image[GrayErode[ImageData[First@ColorSeparate[Ton3CD21dreikanalausgleichF2], "Byte"], #], "Byte"],
ImageSize -> ImageDimensions@Ton3CD21dreikanalausgleichF2] &, {kreismaske[(3 - 1) / 2], kreismaske[(5 - 1) / 2]}]
```

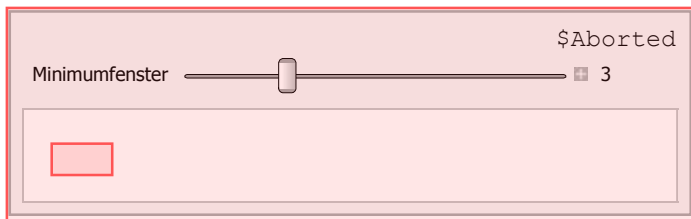






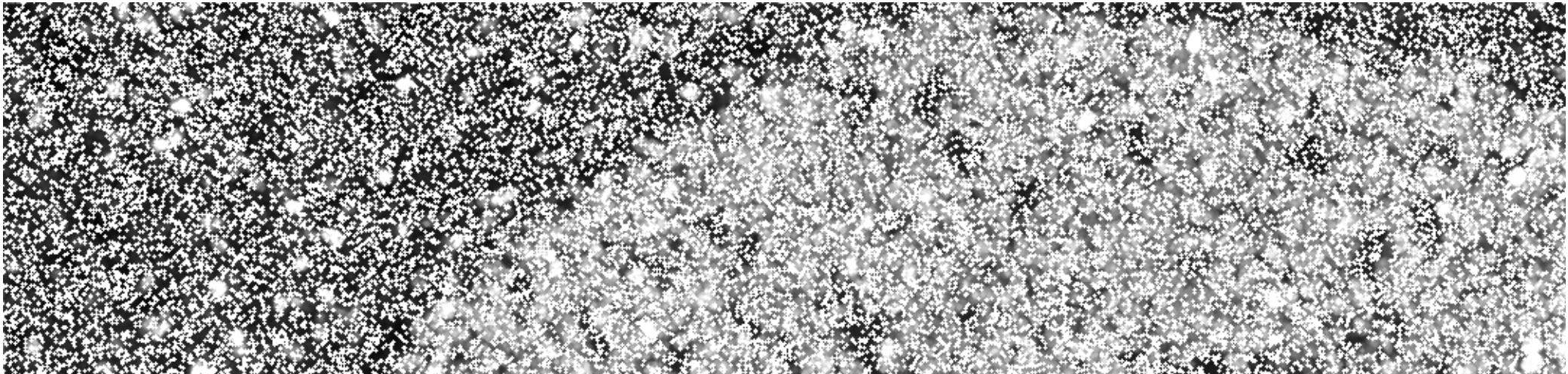
Minimumfilter mit kreisförmigem Strukturelement

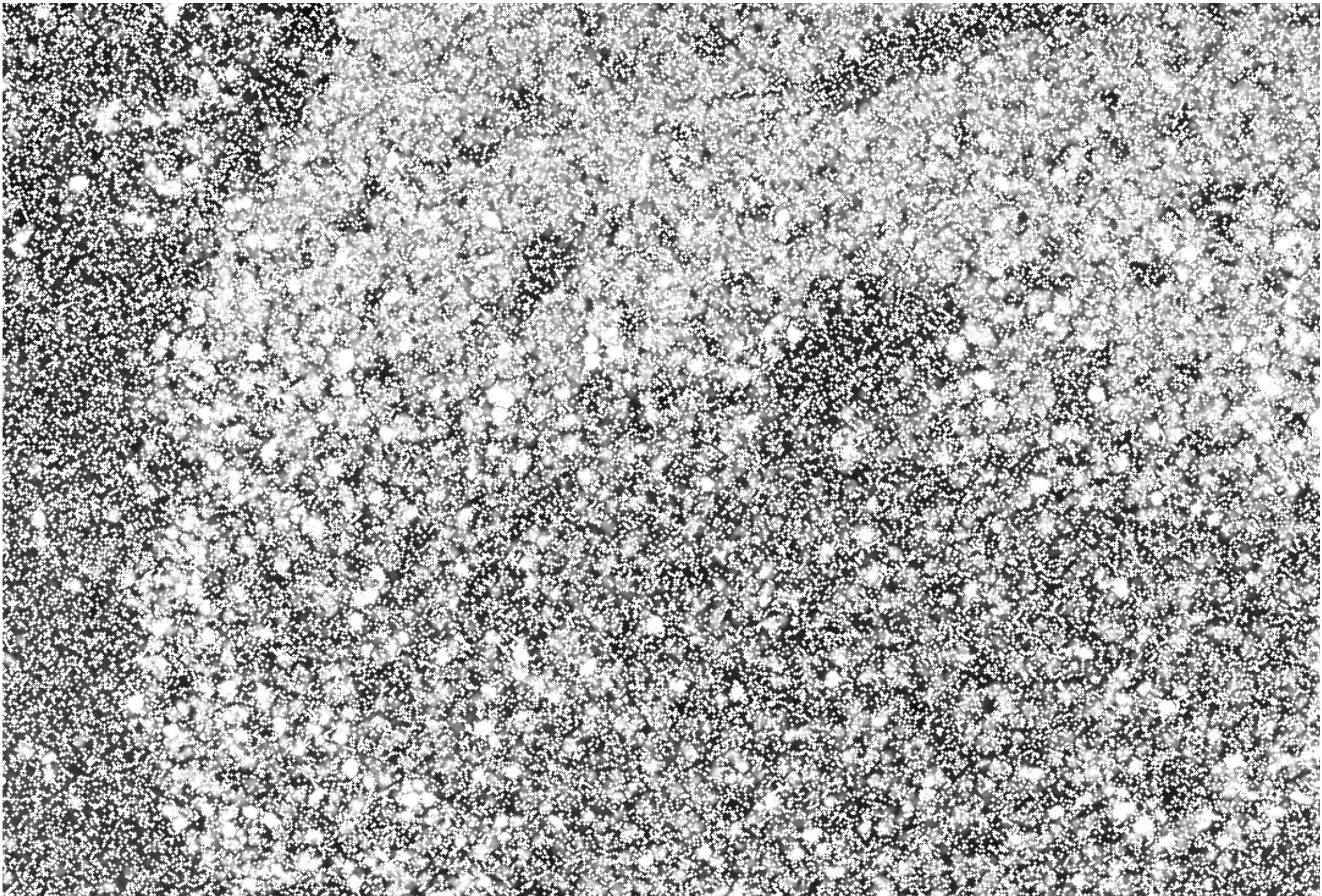
```
Manipulate[ControlActive[größe, Show[Image[GrayErode[#1, kreismaske[(größe - 1) / 2]], "Byte"], ImageSize → Reverse@Dimensions[#1]]],
  {{größe, 3, "Minimumfenster"}, 1, 9, 2, Appearance → "Labeled"}, ContinuousAction → False, SaveDefinitions → True] &[
  ImageData[First@ColorSeparate[Ton3CD21dreikanalausgleichF2], "Byte"]]
```

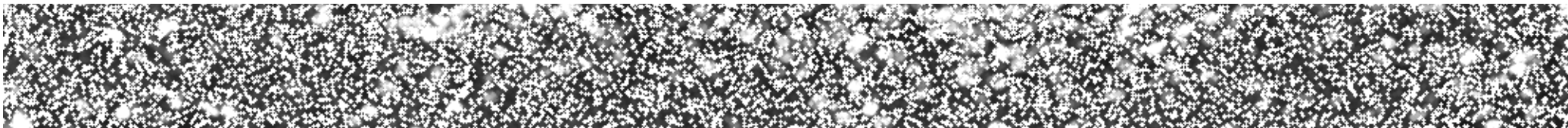


Cave: So wirken Maximumfilter oder Minimumfilter auf extreme Bildstörungen:

```
Show[Image[GrayDilate[#1, kreismaske[(#2 - 1) / 2]], "Byte"], ImageSize → Reverse@Dimensions[#1]] &[ImageData[defektesbild, "Byte"], 3]
```







```
Show[Image[GrayErode[#1, kreismaske[(#2 - 1) / 2]], "Byte"], ImageSize -> Reverse@Dimensions[#1]] &[ImageData[defektesbild, "Byte"], 3]
```

