



Digital
Image
Processing
Learning

Digital Image Processing Learning

Chapter 4

常琳

CVBIOUC

<http://vision.ouc.edu.cn/~zhenghaiyong>

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Basic Theories
2-D Sample Theory
2-D Discrete Fourier Transform and Its Inverse
Properties of the 2-D Discrete Fourier Transform
Fourier Transformed Image
The Basic of Filtering in the Frequency Domain
Basic Steps for Filtering
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Total Frame

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The 2-D Fourier transform and its application to digital image.

The result of Fourier transform:magnitude image and phase image.



2-D Sample Theory

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Sampling used to digitize images.
The sampling intervals need to be

$$\frac{1}{\Delta T} > 2\mu_{max} \quad (1)$$

and

$$\frac{1}{\Delta Z} > 2v_{max} \quad (2)$$

$\frac{1}{\Delta T}$, $\frac{1}{\Delta Z}$ are the separations between samples and μ_{max} , v_{max} are the highest frequency content of the function in both the μ - and v direction.

If the function is under-sampled the periods overlap. Aliasing would result.



Zooming and shrinking

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Zooming may be viewed as over-sampling, shrinking may be viewed as under-sampling.

original image





Zooming

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zoom



Nothing changed.



Shrinking

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shrink



We could see the aliasing clearly.



2-D Discrete Fourier Transform and Its Inverse

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$$F(u, v) = \sum_{x=0}^{M-1} \sum_{y=0}^{N-1} f(x, y) e^{-j2\pi(ux/M+vy/N)} \quad (3)$$

where $f(x, y)$ is a digital image of size $M * N$.

$u = 0, 1, 2, \dots, M - 1$ and $v = 0, 1, 2, \dots, N - 1$

The corresponding relationship between frequency domain and spatial domain.

$$f(x, y) = \frac{1}{MN} \sum_{u=0}^{M-1} \sum_{v=0}^{N-1} F(u, v) e^{j2\pi(ux/M+vy/N)} \quad (4)$$

$x = 0, 1, 2, \dots, M - 1$ and $y = 0, 1, 2, \dots, N - 1$



Properties of the 2-D Discrete Fourier Transform

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■ Relationships Between Spatial and Frequency Intervals

$$\Delta u = \frac{1}{M\Delta T} \quad (5)$$

$$\Delta v = \frac{1}{N\Delta Z} \quad (6)$$

■ Translation and Rotation

$$f(x, y) e^{j2\pi(u_0x/M + v_0y/N)} \Leftrightarrow F(u - u_0, v - v_0) \quad (7)$$

$$f(x - x_0, y - y_0) \Leftrightarrow F(u, v) e^{-j2\pi(x_0u/M + y_0v/N)} \quad (8)$$

Rotating $f(x, y)$ by an angle θ_0 rotates $F(u, v)$ by the same angle. Rotating $F(u, v)$ rotates $f(x, y)$ by the same angle.

■ Periodicity



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■ Symmetry Properties

About the center point of a sequence.

$$w_e(x, y) = w_e(M - x, N - y) \quad (9)$$

$$w_o(x, y) = -w_o(M - x, N - y) \quad (10)$$

■ Spectrum and Phase Angle

While the magnitude of the 2-D DFT is an array
Whose components determine the intensities in the
image, the corresponding phase carry much of the
information about where discernable objects are located
in the image.



Properties of the 2-D Discrete Fourier Transform

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■ The 2-D Convolution Theorem

Append zeros to solve wraparound error problem.

$f(x, y)$ and $h(x, y)$ are two image arrays of sizes $A \times B$ and $C \times D$

The resulting padded images are both of size $P \times Q$. Where $P \geq A + C - 1$ and $Q \geq B + D - 1$



Fourier Transform Image

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Original image





Fourier Transform Image

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DFT image





Rotating

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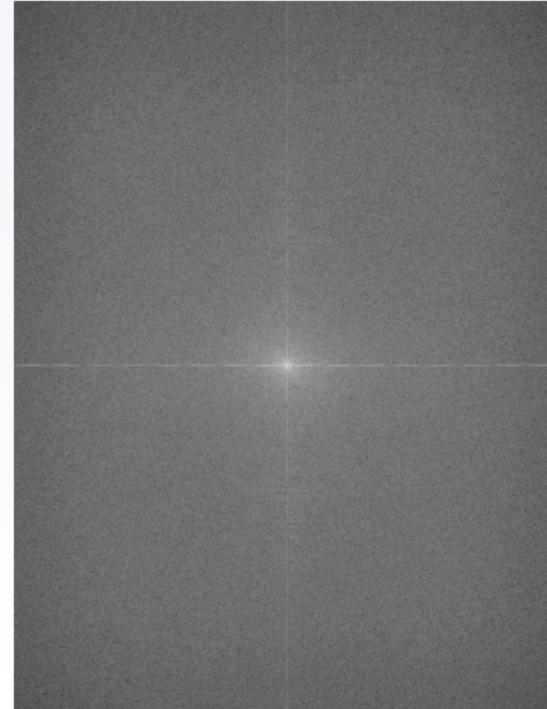
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Rotating image





Summary of Fourier Transform

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- The DFT of an image will be a frequency spectrum, whose magnitude is connected with its light and the phase is connected with its location about the original position. The spectrum rotates by the same angle of a rotated image.
- The low frequencies correspond to the slowly varying intensity components of an image while the high frequencies correspond to faster intensity changes.



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Modifying the the Fourier transform to achieve a specific object,computing the inverse DFT to get back to the image domain.

Equations:

$$g(x, y) = \mathcal{F}^{-1}[H(u, v)F(u, v)] \quad (11)$$



Steps for Filtering

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Lowpass Filters

- 1 An input image $f(x, y)$ of size $M \times N$, obtain the padding parameters $P = 2M, Q = 2N$.
- 2 Form $f_p(x, y)$ of size $P \times Q$ by appending zeros to $f(x, y)$
- 3 Multiply $f_p(x, y)$ by $(-1)^{x+y}$ to center its transform
- 4 Compute the DFT from step 3
- 5 Generate a real, symmetric filter function, $H(u, v)$ of size $P \times Q$ with center at coordinates $(P/2, Q/2)$.
$$G(u, v) = H(u, v)F(u, v)$$
- 6 $g_p(x, y) = \text{real}[\mathcal{F}^{-1}[G(u, v)]](-1)^{x+y}$, the real part is selected in order to ignore parasitic complex components resulting from computational inaccuracies.
- 7 Obtain the final processed result, $g(x, y)$, by extracting the $M \times N$ region from the top, left quadrant of $g_p(x, y)$



Lowpass Filters

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Lowpass Filters

Image smoothing.

Origin image





Ideal Lowpass Filters

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ILPF image $D_0 = 100$





Butterworth Lowpass Filters

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BLPF image $D_0 = 100, n = 2$





Gaussian Lowpass Filters

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GLPF image $D_0 = 100$





Filters Summary

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Lowpass Filters

ILPF:ringing.

BLPF:good compromise between effective lowpass filtering and acceptable ringing.

GLPF:no ringing,less smoothing than the BLPF.



Highpass Filters-Butterworth Highpass Filters

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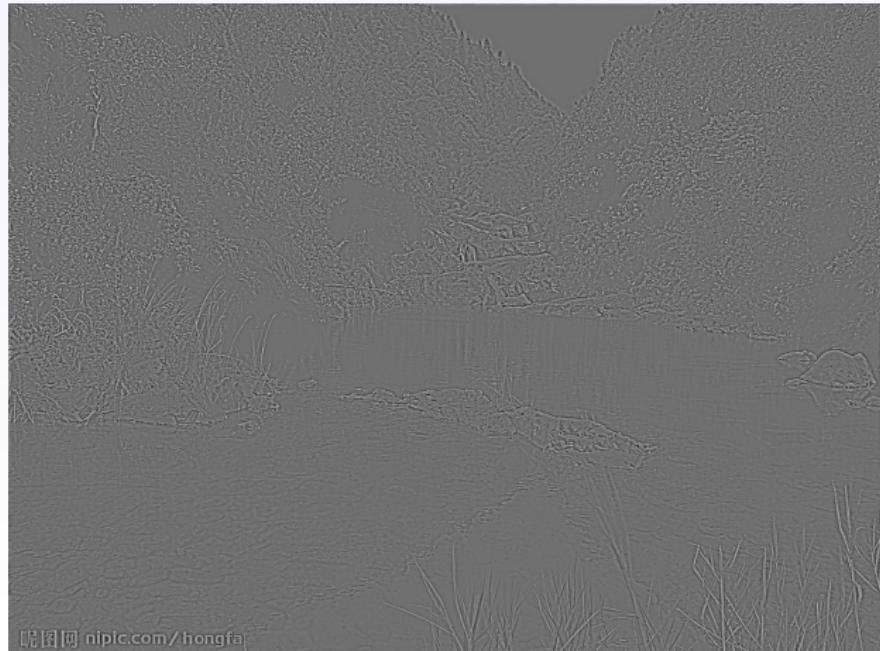
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BHPF image





Highpass Filters

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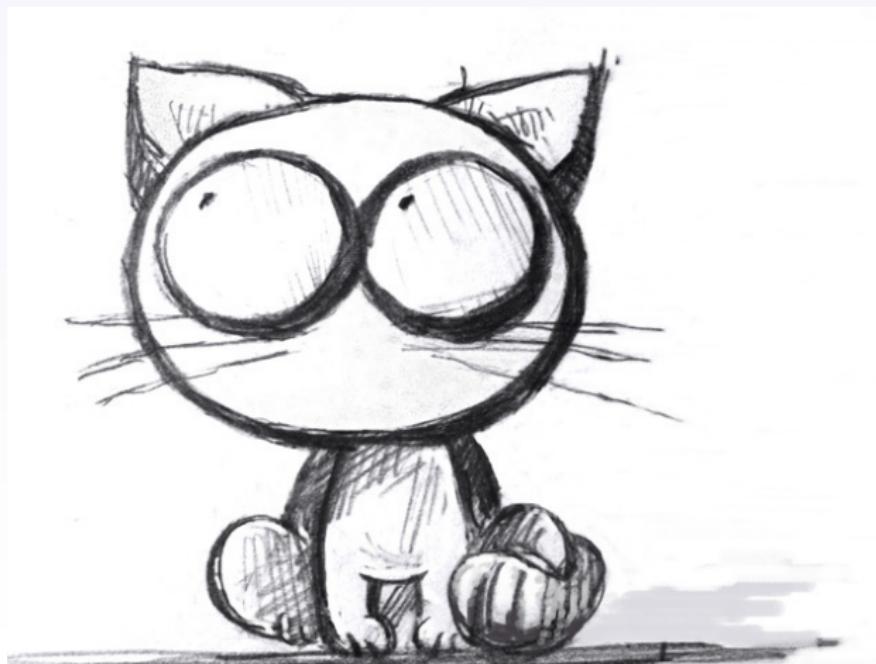
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Image Sharpening.

Origin image





Ideal Highpass Filters

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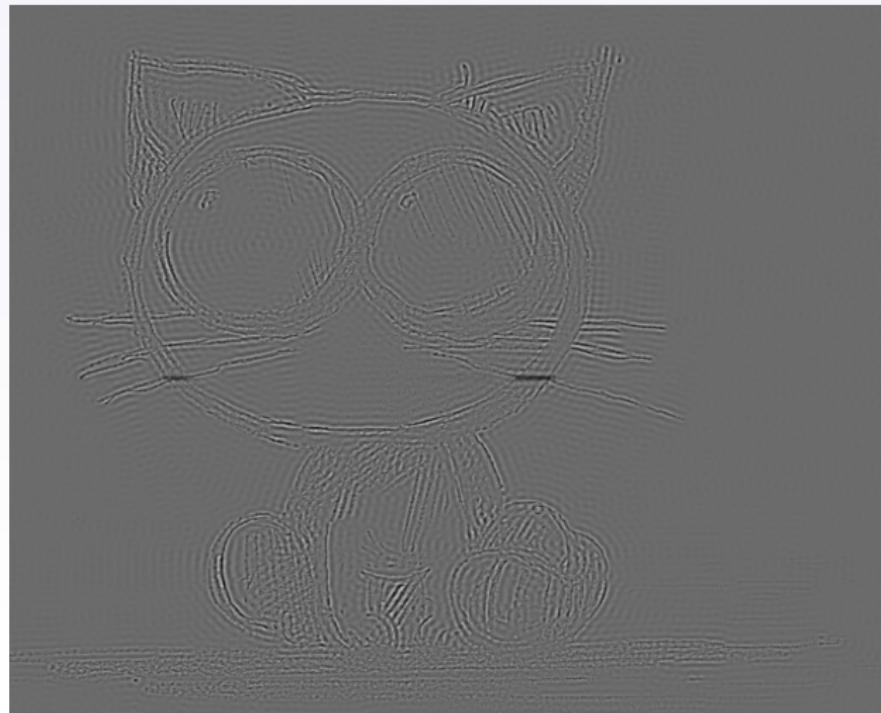
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IHPF image





Butterworth Highpass Filters

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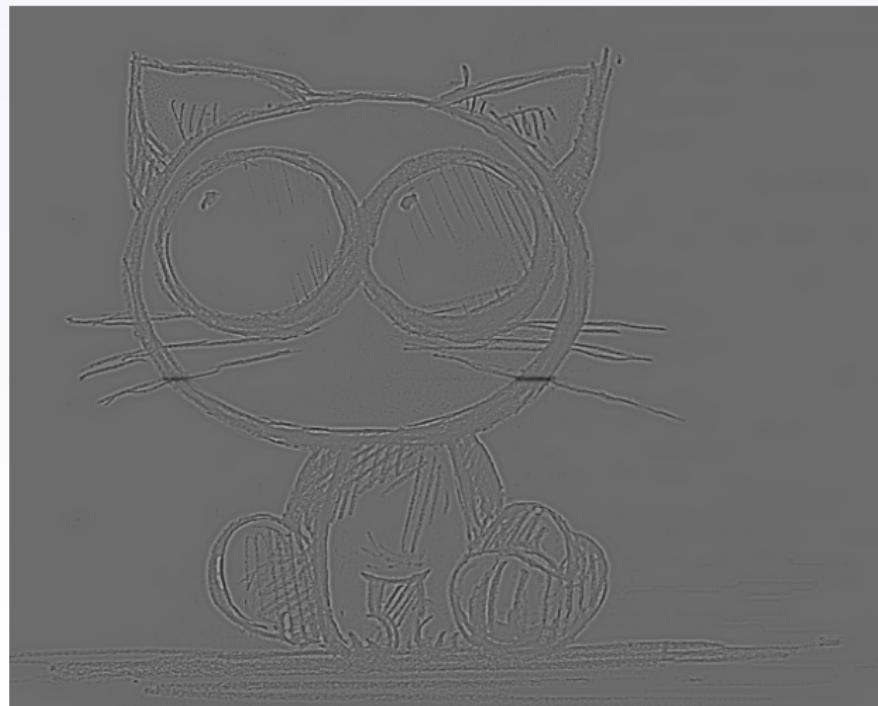
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BHPF image





Equalization

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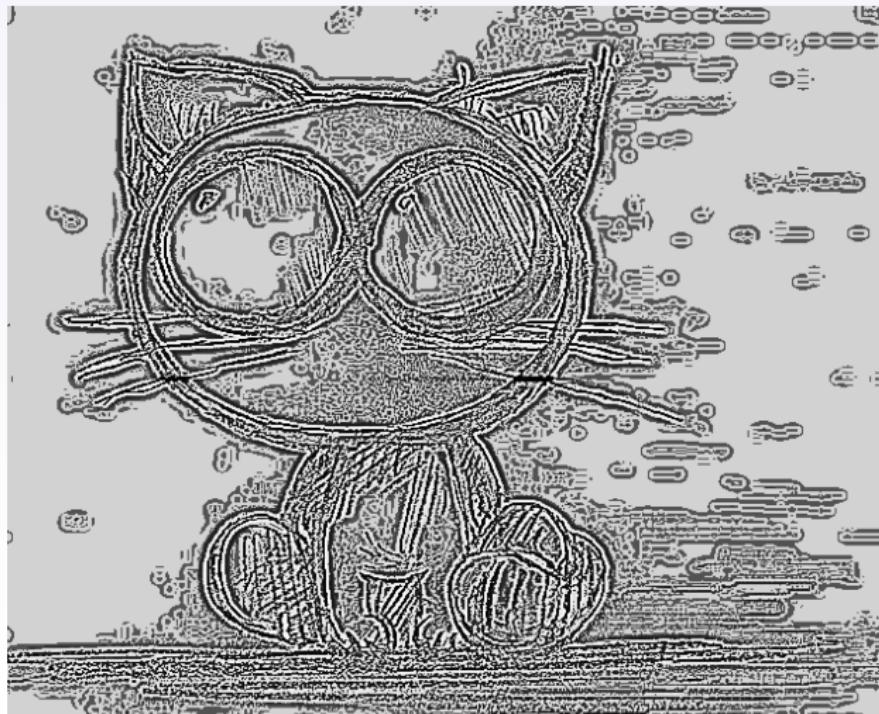
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Equal image





Gaussian Highpass Filters

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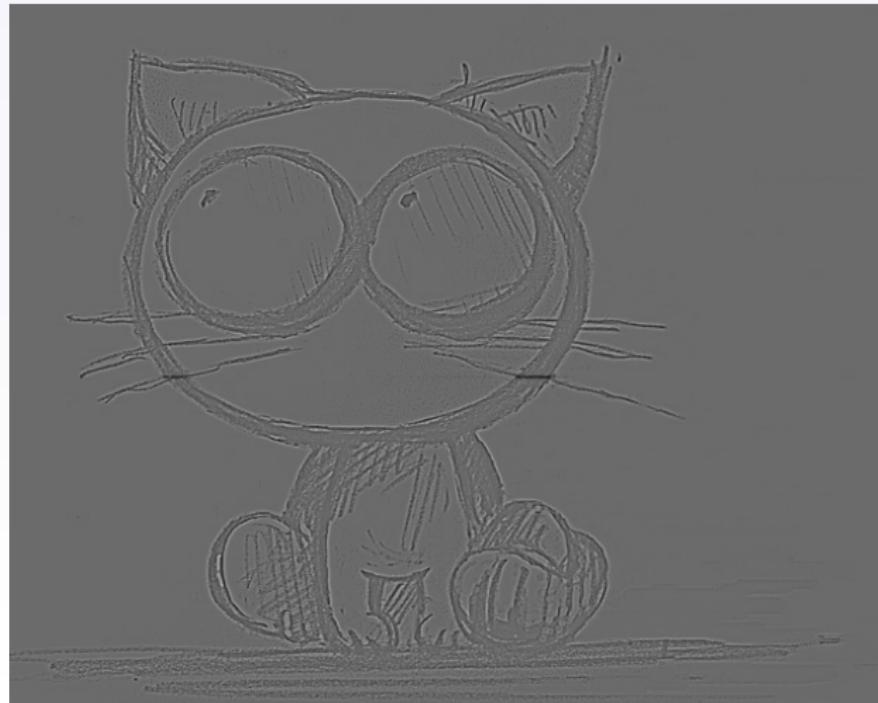
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GHPF image





High-Frequency-Emphasis Filters

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$$g(x, y) = \mathcal{F}^{-1}\{[k_1 + k_2 * H_{HP}(u, v)]F(u, v)\} \quad (12)$$

$k_1 \geq 0$ gives controls of the offset from the origin



High-Frequency-Emphasis Filters

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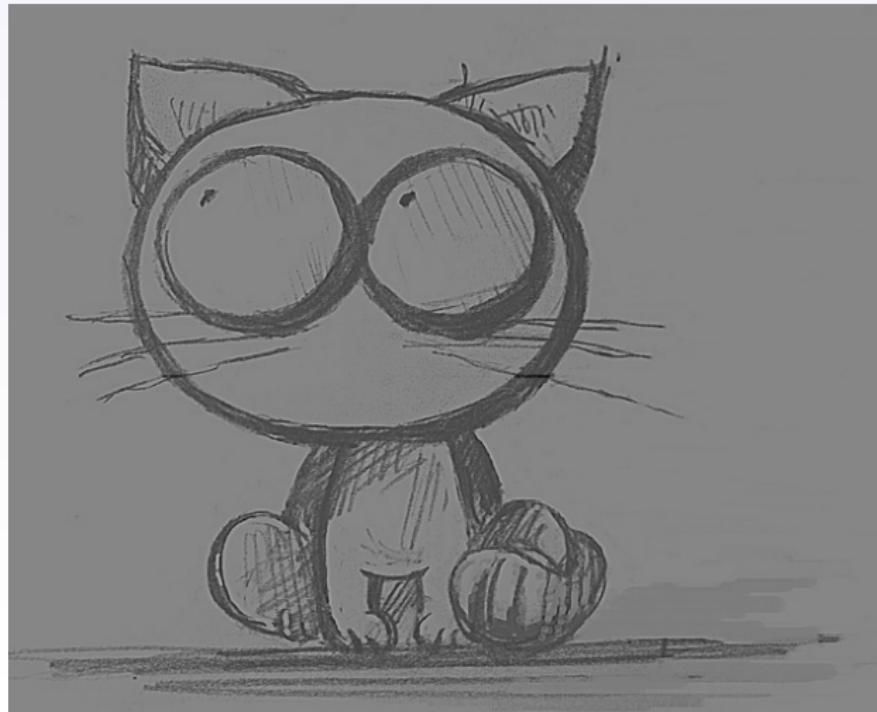
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$$k_1 = 1, k_2 = 4$$





High-Frequency-Emphasis Filters

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$$k_1 = 1, k_2 = 4$$





Homomorphic Filters

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Homo image



A procedure for improving the appearance of an image by simultaneous intensity range compression(\ln) and contrast enhancement(filter).



Selective Filters

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Origin image





Bandpass Filters

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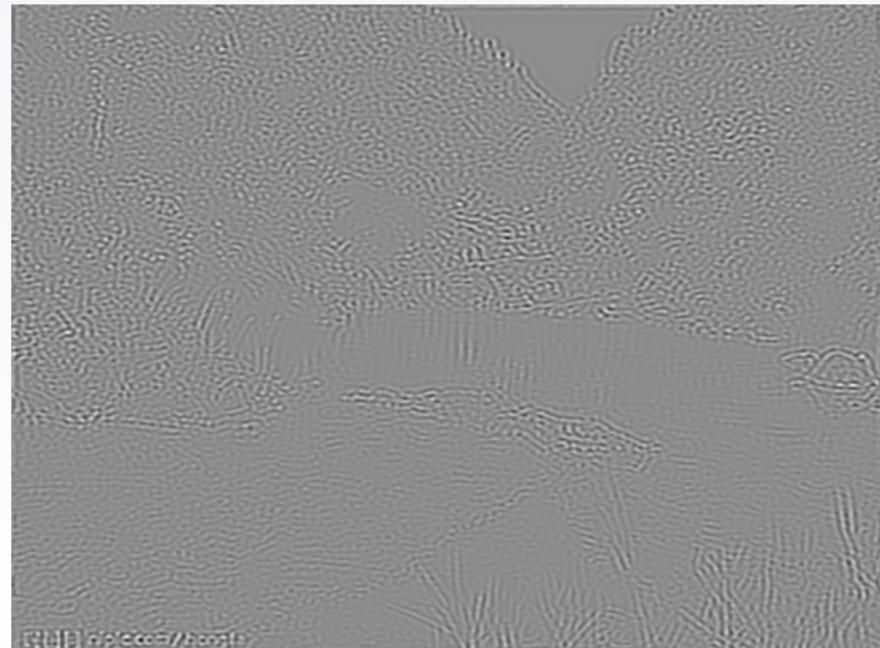
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$$D_0 = 100, w = 40$$





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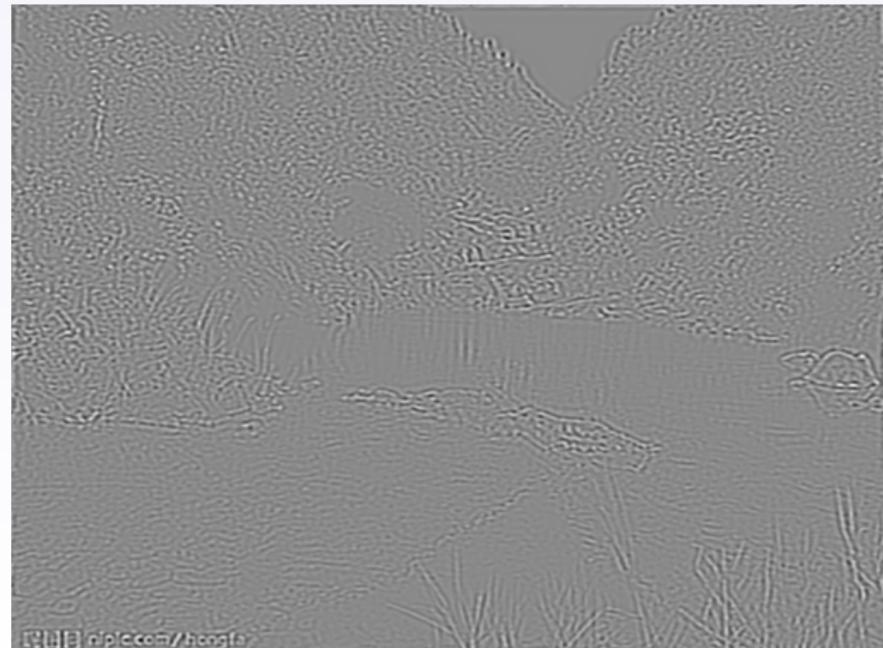
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$$D_0 = 100, w = 80$$





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$$D_0 = 5, w = 140$$

