



Image Filtering

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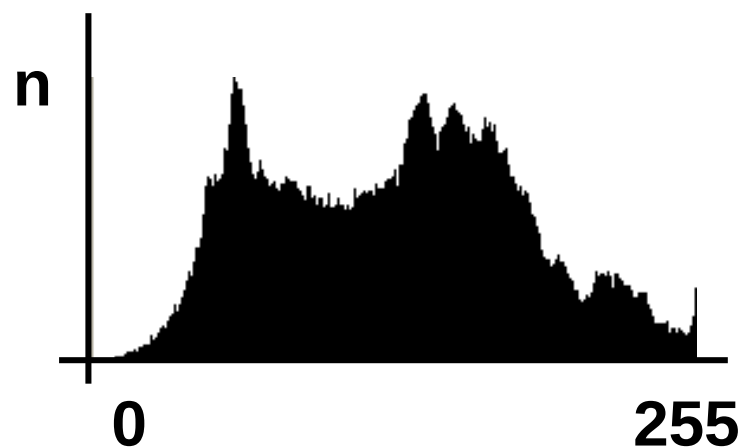
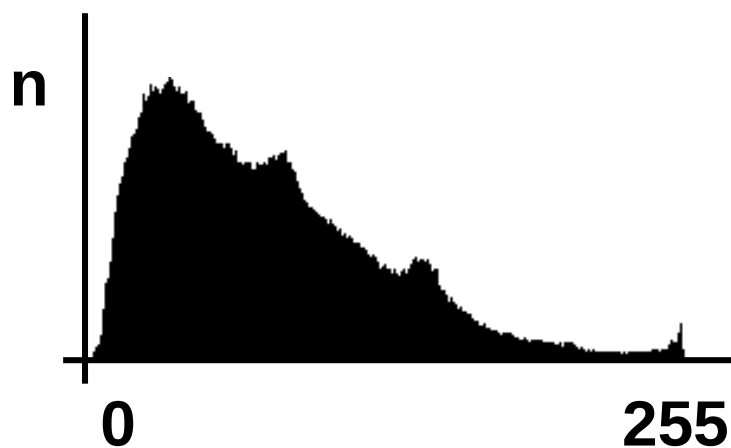
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Image Histograms

- ◆ **Frequency table** of individual brightness (and sometimes also colour) values
 - ◆ **Continuous case** - probability density
- ◆ Main use - photography





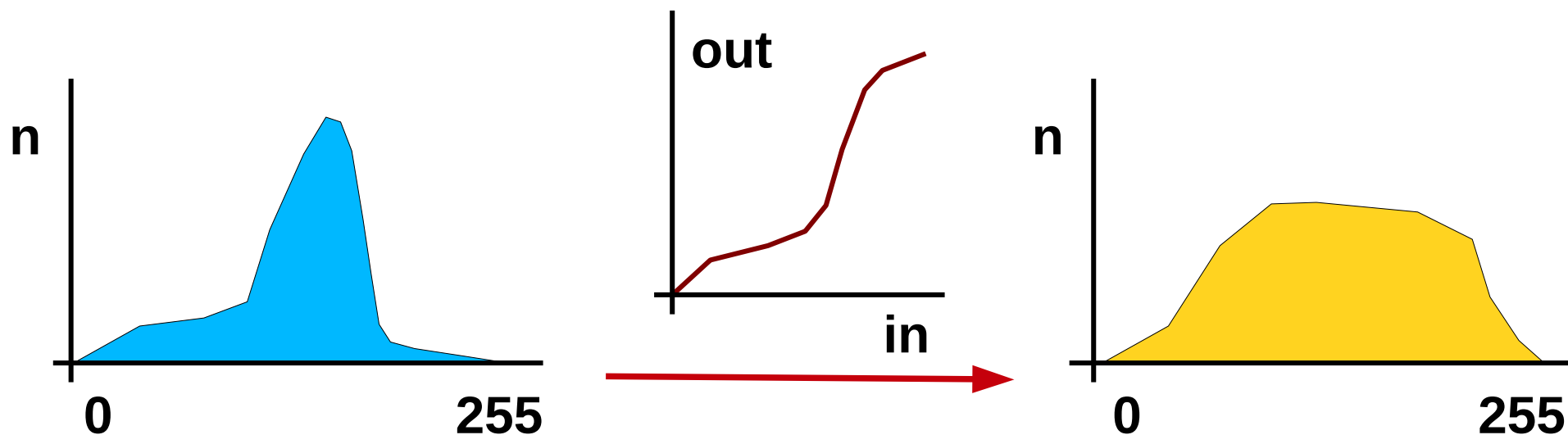
Brightness measures

- ◆ Histogram → first overview of **exposure**
- ◆ Over- or underexposed images
- ◆ Insufficient or too large **contrast**
- ◆ „**Good histogram**“
 - ◆ Image has shades in all brightness ranges
 - ◆ ~ retains details both in dark and bright parts
- ➡ Is it possible to „fix“ a bad histogram?



Brightness transform

- ◆ **Transfer function** between brightness before and after
 - ◆ $t: \mathbb{R} \rightarrow \mathbb{R}$ (usually $[0; 1] \rightarrow [0; 1]$)
- ◆ Gamma correction
- ◆ Contrast enlargement

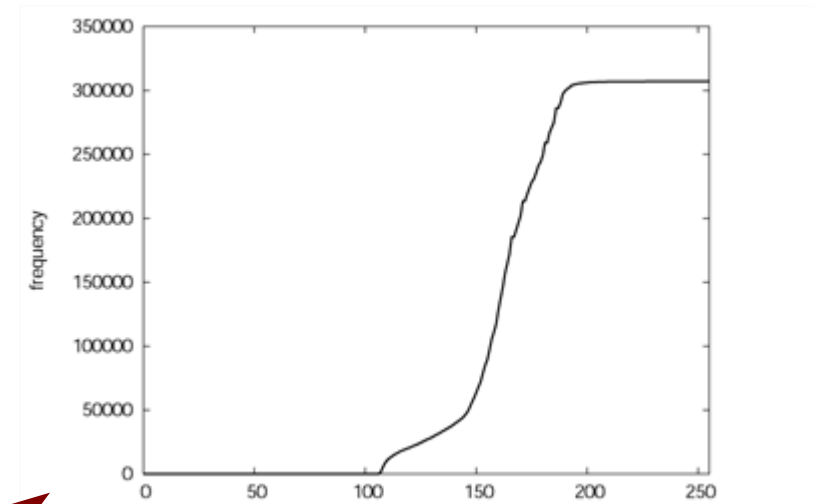
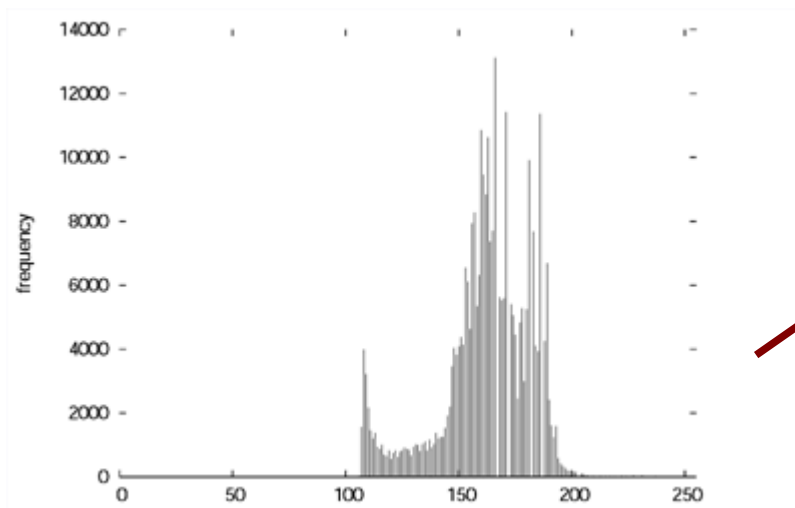




Histogram Equalisation

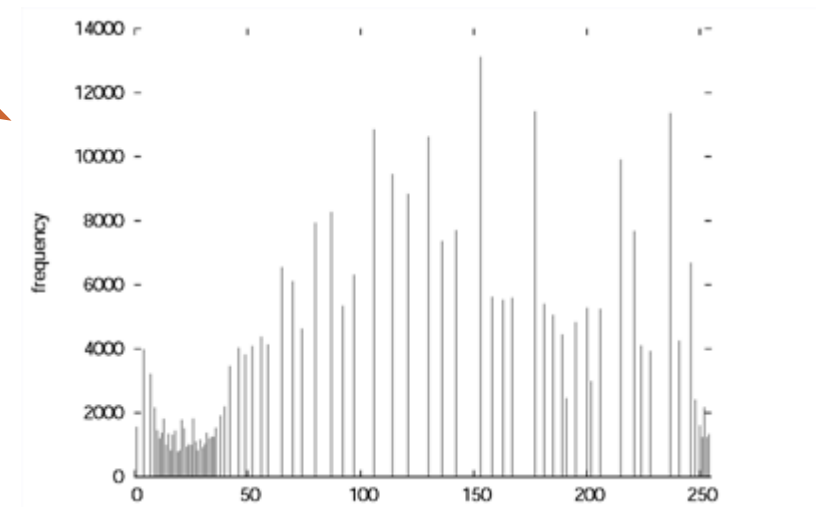
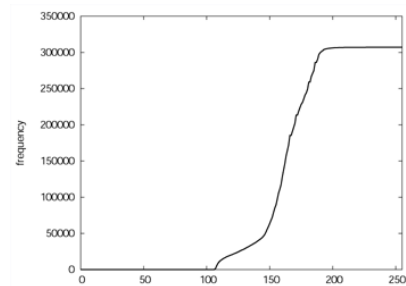
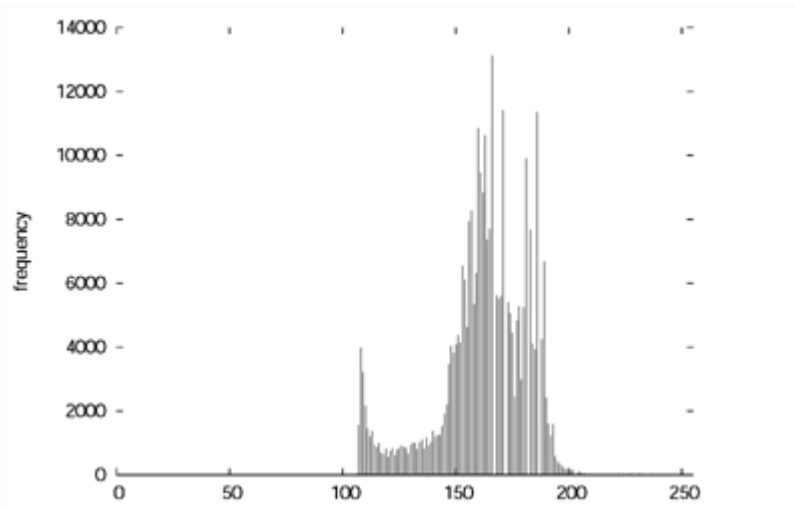
- ◆ Artificial brightness transform
 - ◆ Seeks to equalise histogram
- ◆ Manipulation of all brightness „columns“
 - ◆ Distributes shades stochastically
- ◆ **Local histogram equalisation**
 - ◆ Analysis only of of pixel surround
 - ◆ Can improve readability of the overall image
 - ◆ Does not preserve uniformly coloured areas!

Global equalisation example

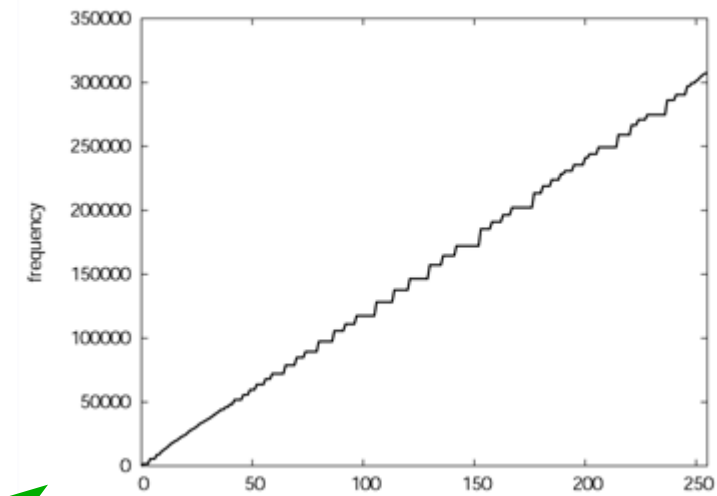
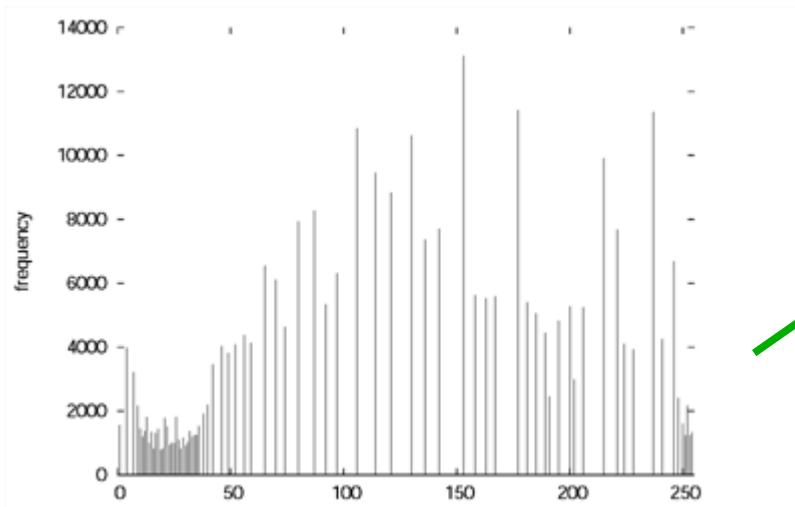


**Cumulative histogram
(luminance transform)**

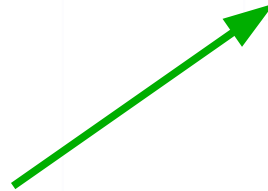
Luminance transformation



Result after equalisation



cumulative histogram





Colour operations

- ◆ Transformation **RGB** → **HSV**
- ◆ Changes to **saturation S**
- ◆ Changes to **hue H**
 - ◆ Change of object colours
 - ◆ Selective de-colourisation ...
- ◆ Reverse transformation **H'S'V'** → **R'G'B'**

HSV operations



HSV operations



Examples of colour operations



(algorithm: Miroslav Hrivík)

Examples of colour operations



(photo & algorithm: David Marek)

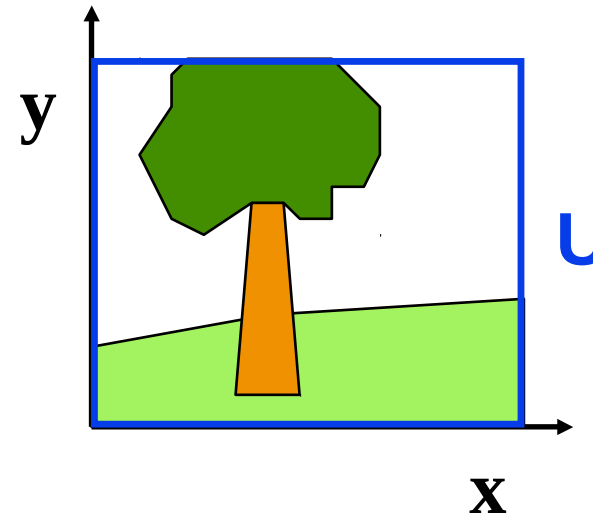
Mathematical Definition of Images



„image function”

$$f: U \subset \mathbb{R}^2 \rightarrow \mathbb{R}^n$$

$$f: [x, y] \rightarrow [a_1, a_2, \dots, a_n]$$



Point location
in the plane

Image attributes
(colour, transparency)



Convolution

- ◆ „Weighted Moving Average“
 - ◆ Weight function g
- ◆ Close connection with the **Fourier transform**
 - ◆ Spectral domain
 - ◆ Filters like „low pass“ etc.

$$(f * g)(x) = \int_{-\infty}^{\infty} f(t) \cdot g(x-t) dt$$

1D version



Discrete Convolution

- ◆ „Weighted moving average“ of a series (table)
 - ◆ Series (table) of weights **g**
- ◆ Associated with the **Discrete Fourier Transform (DFT)**

$$(f * g)[n] = \sum_{m=-\infty}^{\infty} f[m] \cdot g[n-m]$$

1D version



Convolution Effects

- Low pass filter (only positive values of \mathbf{g})
 - ◆ Blurring
 - ◆ Noise reduction
- High pass filter (positive and negative values, sum $\mathbf{0}$)
 - ◆ Edge detection
 - ◆ Image sharpening
- Complex spectral filters
- Other effects („emboss“, ...)



Image blurring



original



Gauss

1	2	1
2	4	2
1	2	1

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Edge detection („high-pass“)



original



Sobel (2 directions)

1	2	1
0	0	0
-1	-2	-1

1	0	-1
2	0	-2
1	0	-1

Image Sharpening



Laplacian

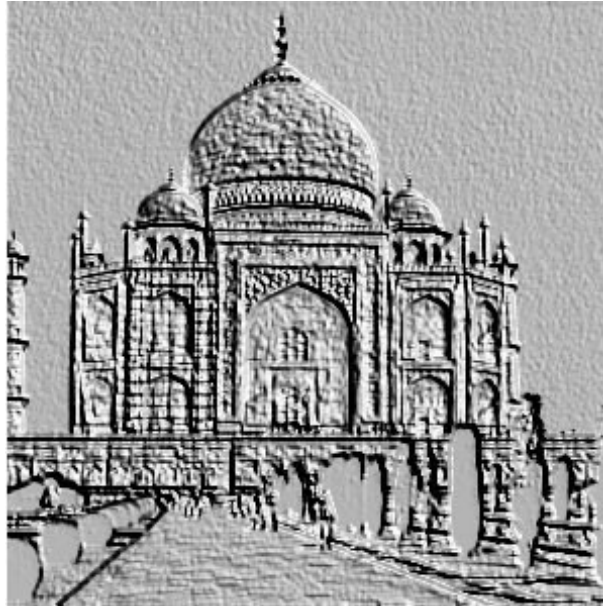
0	-1	0
-1	4	-1
0	-1	0



Added to image

0	-1	0
-1	5	-1
0	-1	0

„Emboss“ effect



emboss

-1	0	0
0	1	0
0	0	0



original

Non-uniform blur



original



Radial blur
(1D blur)



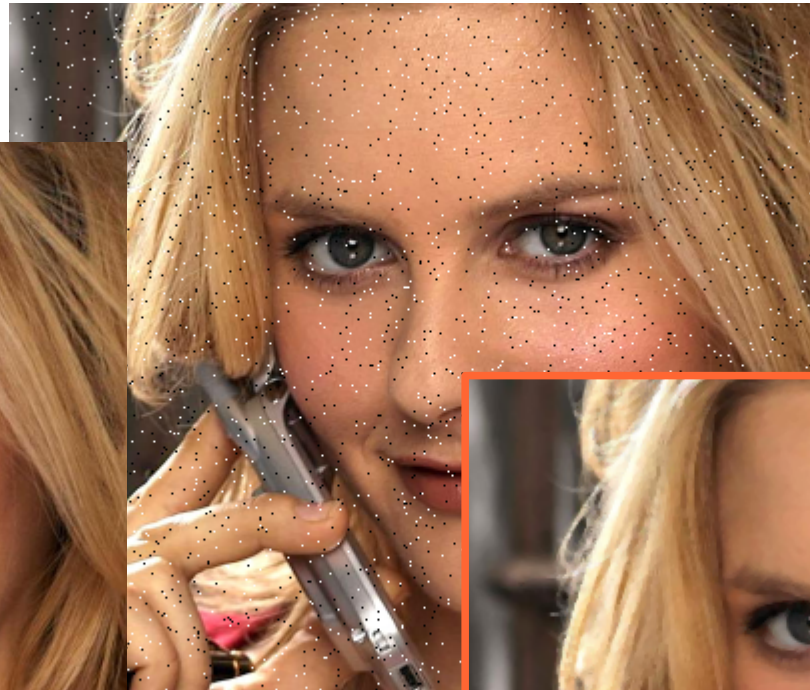
Non-linear filters („rank filters“)

- ◆ **Windowed filtering** (as with convolution)
- ◆ Pixel ranking in the window, according to :
 - **median** - noise reduction, artistic effects, ...
 - **minimum** - „erosion“
 - **maximum** - „dilatation“
- ◆ Various **window shapes**
 - ◆ square
 - ◆ circle
 - ◆ cross (preserves sharp corners)

Median for Noise Reduction



Original



“Salt & Pepper”



Median 3×3



Median: Image Repair



Dilation and Erosion



Dilation



Erosion



Noise suppression

- ◆ Advanced techniques seek to **preserve edges**
 - ◆ Direct frequency reduction does not work
- ◆ Variants of **median filtering**
- ◆ **Anisotropic filtering**
 - ◆ Smudging on image contours (along the gradient of the image function)
- ◆ Filtering with a **rotating mask**
 - ◆ The pixel neighbourhood is considered
 - ◆ Average with minimal variance



Artistic filters

- ◆ Imitation of **painter/illustrator techniques**
- ◆ **Simulated strokes** of brushes / crayons etc.
- ◆ Effects of type „**mosaic**“, stained glass, ...
- ◆ **NPR (non-photorealistic) effects**
 - ◆ Edge highlighting
 - ◆ Filling object interiors
 - ◆ Area accretion (segmentation)
 - ◆ ...

Example – artistic filter



original



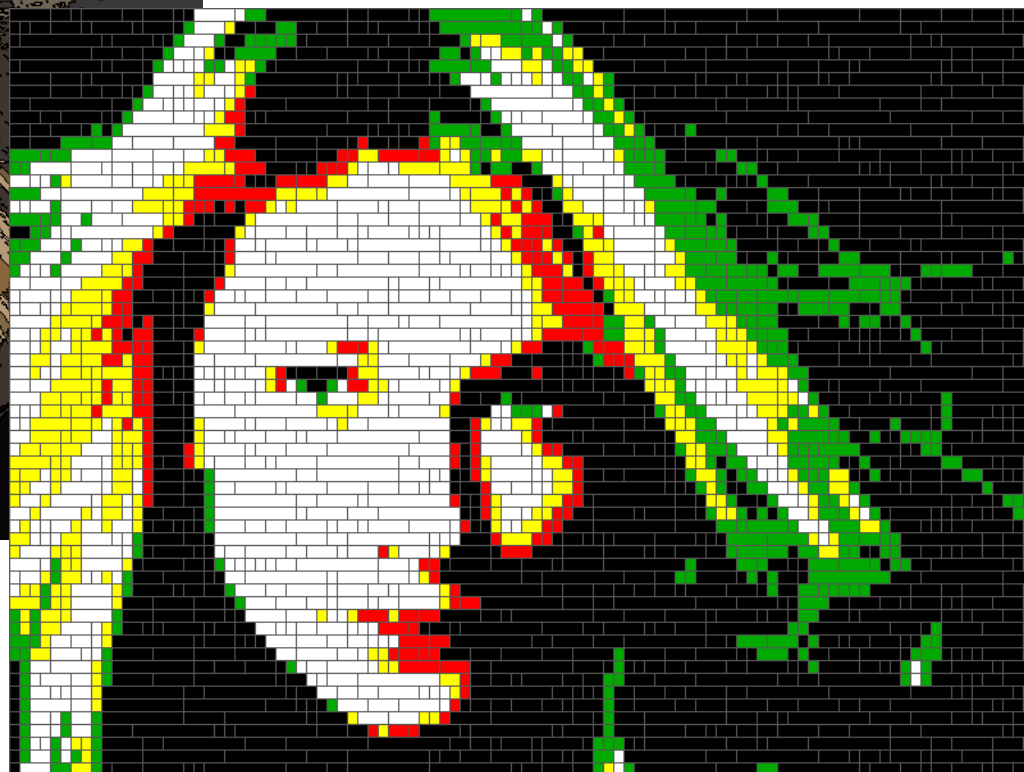
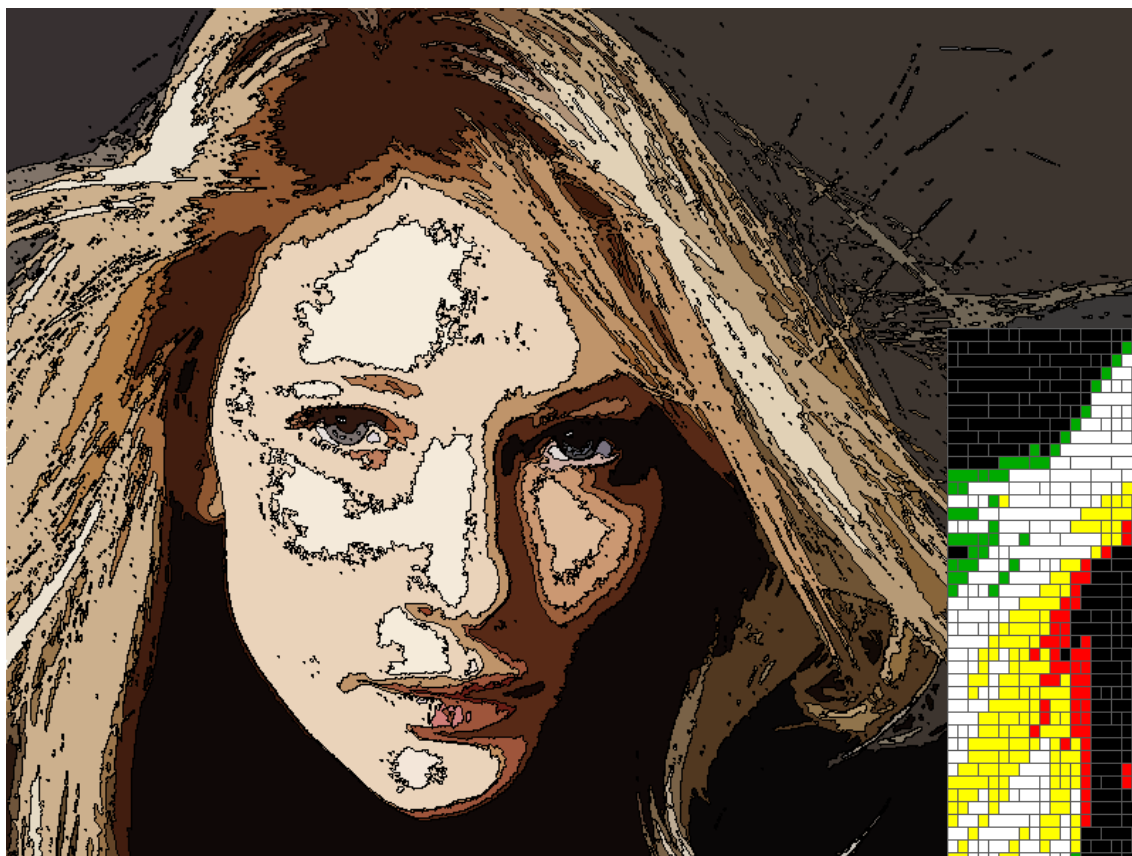
drawing

Examples – NPR filters

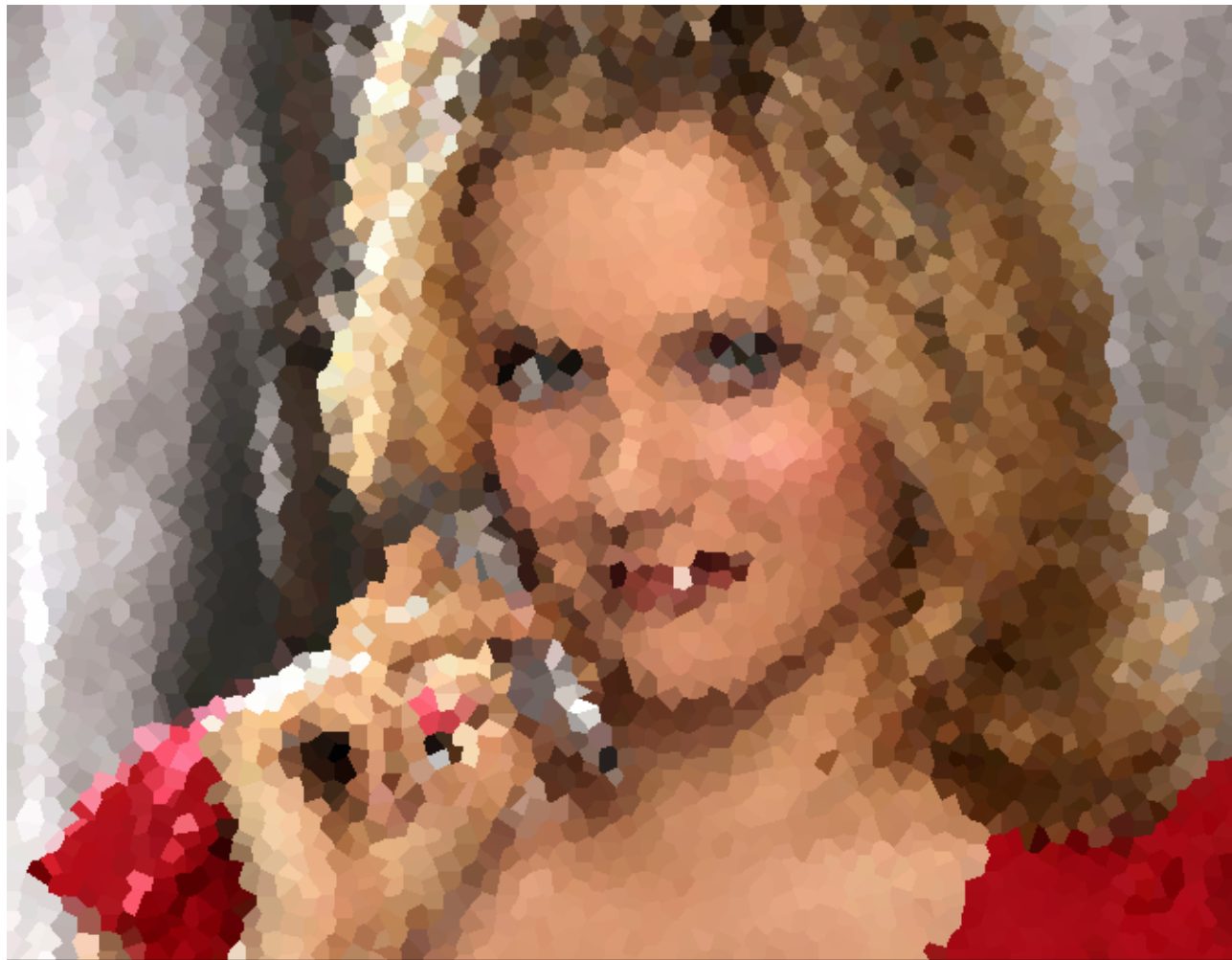




Examples – NPR filters



Example - mosaic



Literature



- ◆ Pratt W. K.: ***Digital Image Processing: PIKS Inside***, 3rd Edition, Wiley-Interscience, 2001
- ◆ Gonzales R. C, Woods R. E.: ***Digital Image Processing***, 3rd Edition, Prentice Hall, 2007