



Berner Fachhochschule
Haute école spécialisée bernoise
Bern University of Applied Sciences

Introduction to Computer Vision:

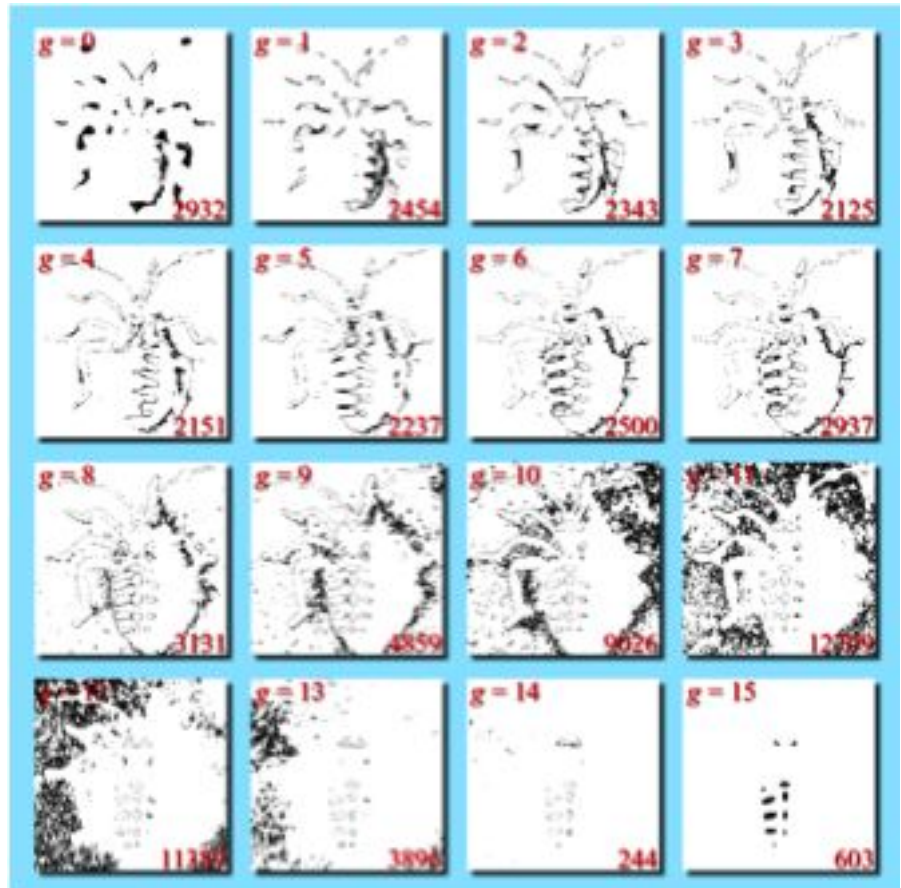
Image Statistics

Marcus Hudritsch (hsm4)

Image Statistics: Histogram

- Image Acquisition is a measuring process.
- It can be therefore **statistically analyzed**.
- The most common statistic is the NO. of pixels (n_g) in each gray level:

$$h(g) = n_g$$



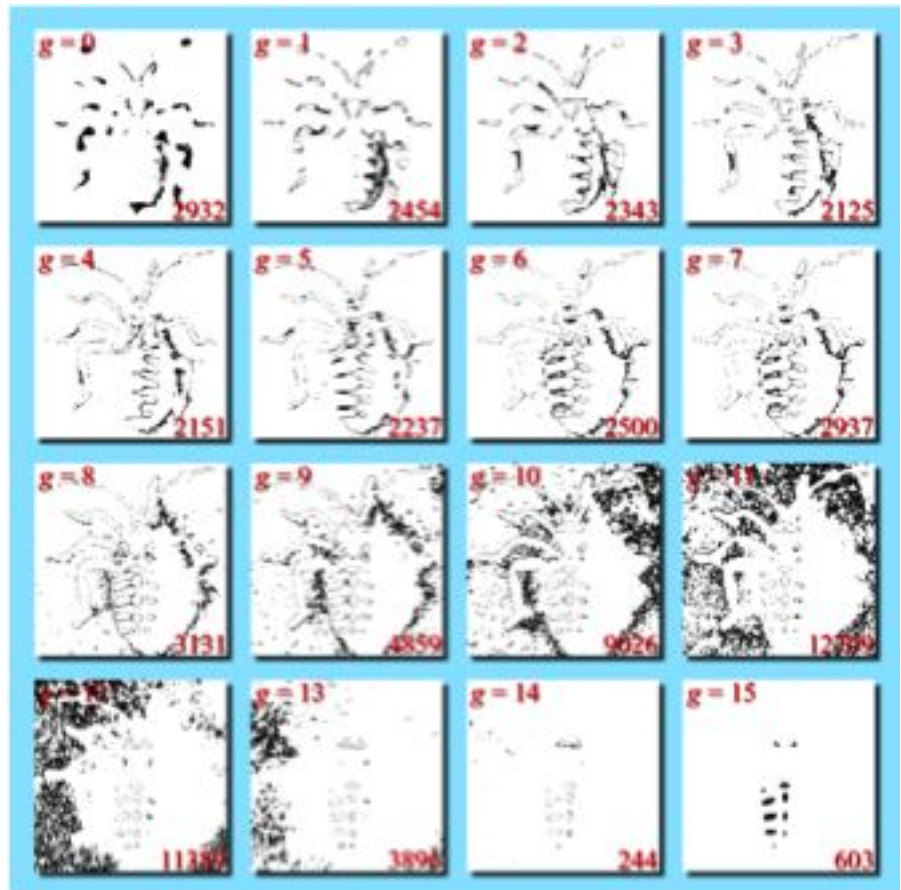
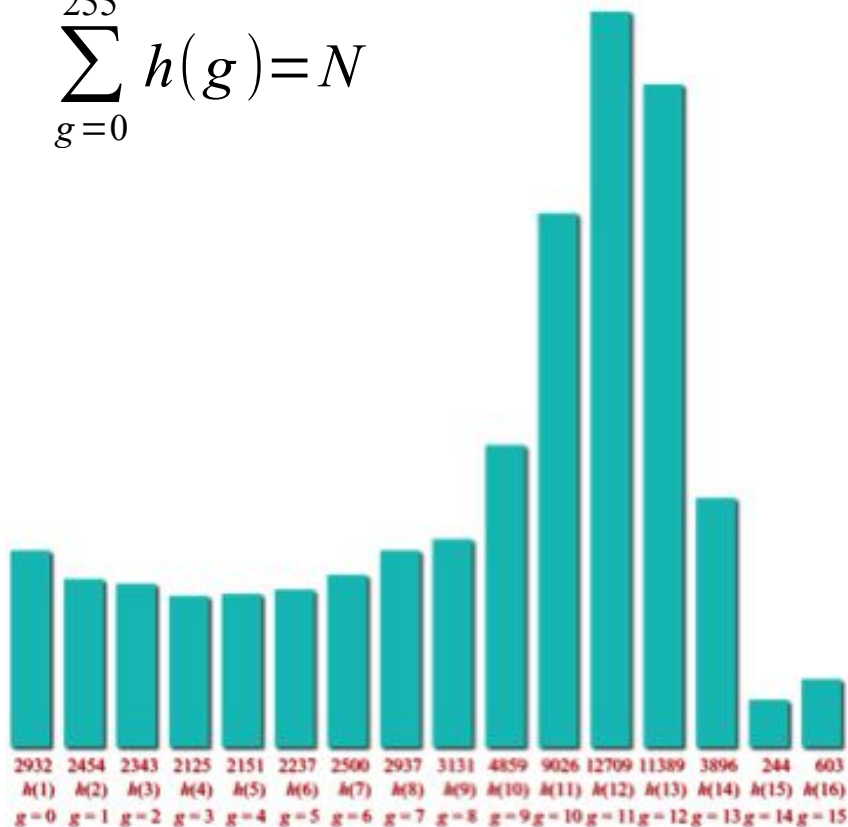
Images by R.A. Peters, Vanderbilt University

Image Statistics: Histogram

- The **bar chart** of 16 gray level count is called **histogram**.
- The sum of all levels is equal to the sum of all pixels:

$$h(g) = n_g$$

$$\sum_{g=0}^{255} h(g) = N$$

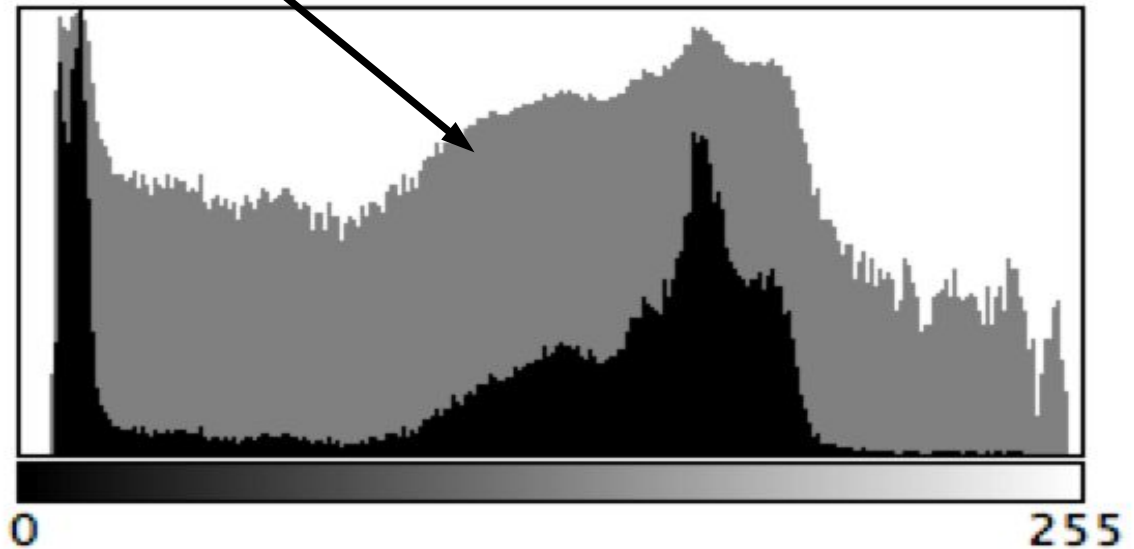


Images by R.A. Peters, Vanderbilt University

Image Statistics: Histogram

- The visualize small occurrences the histogram can be **logarithmic scaled**:

Logarithmic scale



Count: 65536
Mean: 118.724
StdDev: 62.342

Min: 7
Max: 253
Mode: 14 (1685)

Image Statistics: Color Histogram



Images by R.A. Peters, Vanderbilt University

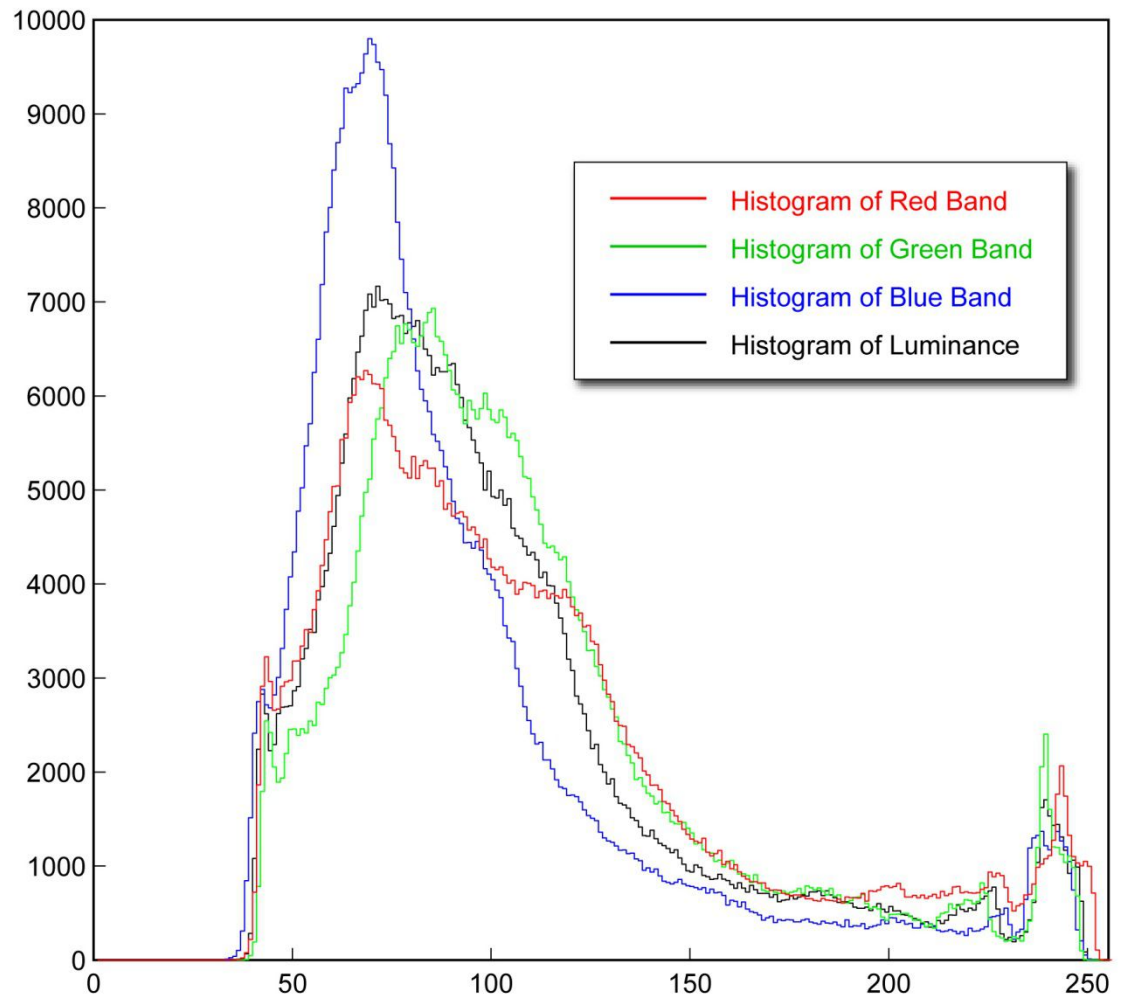


Image Statistics: Histogram

How does the histogram look like from the followin images:

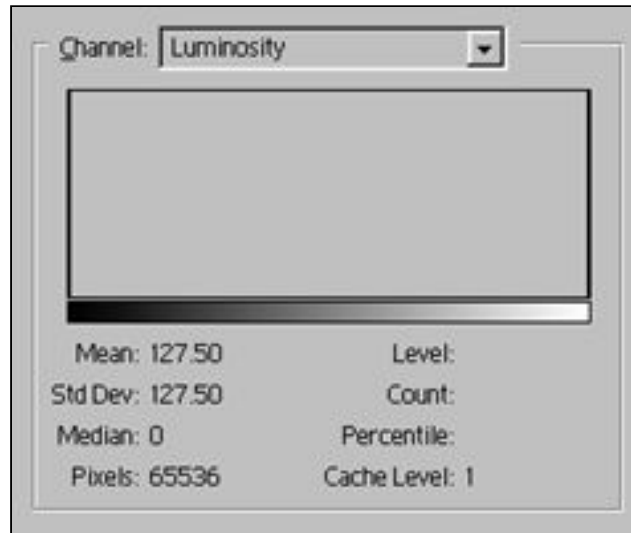
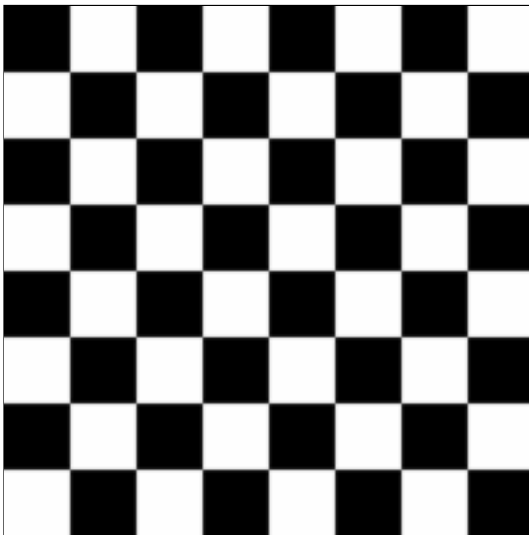
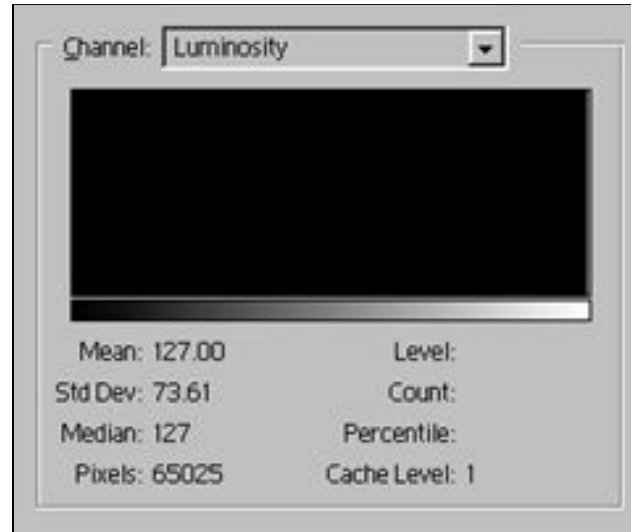
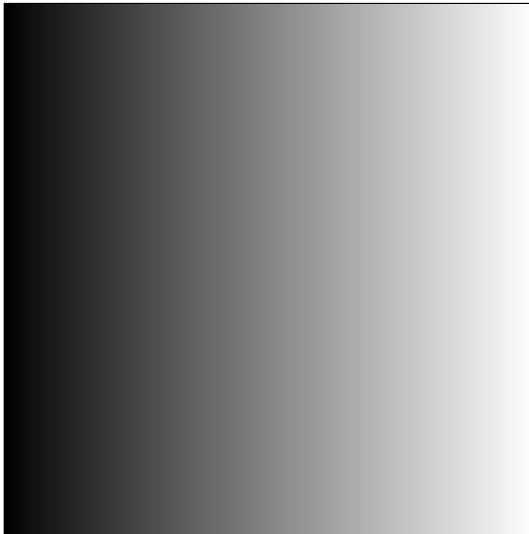


Image Statistics: Probability Density Function

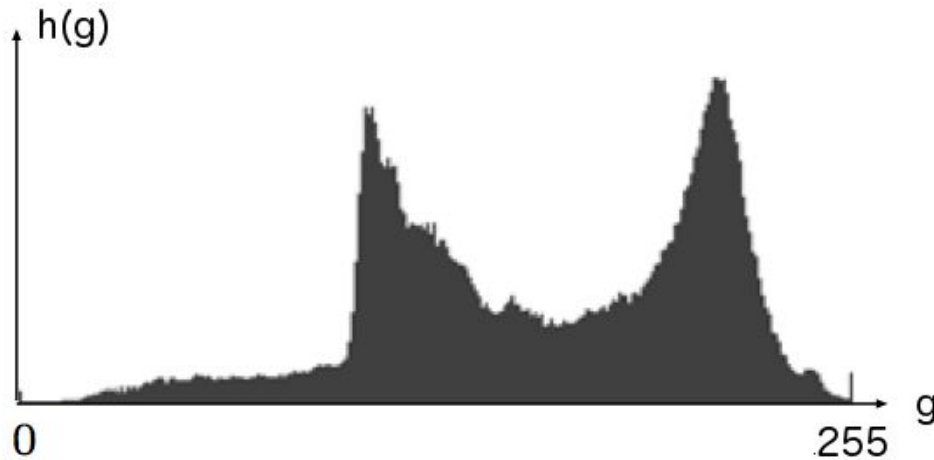
- If the histogram is normalized we get the **Probability Density Function (PDF)**.
- To normalize it we divide all frequencies $h(g)$ by the sum of all pixels.
- $p(g)$ says how probable a pixel has a gray value = g .
- The sum of all probabilities is 1 (100%).

$$p(g) = \frac{n_g}{N}$$

$$\sum_{g=0}^{255} p(g) = 1$$

Image Statistics: Cumulative Histogram

- The **cumulative histogram** sums up all level frequencies.
- It is used in algorithms like the histogram equalization.



$$H(g) = \sum_{j=0}^g h(j)$$

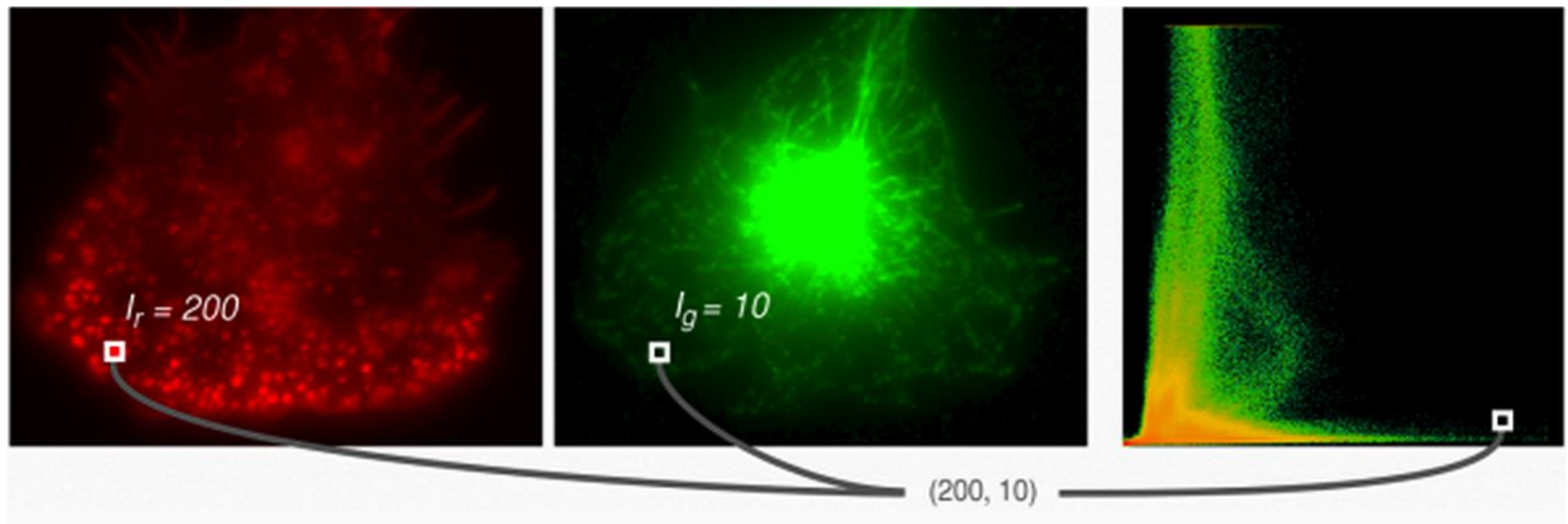
Image Statistics: Cumulative Density Function

- If the cumulative histogram is normalized we get the **Cumulative Probability Density Function (cdf)**.
- To normalize it we divide all cumulative sums $H(G)$ by the sum of all pixels.
- $P(g)$ says how probable a pixel has a gray value $\leq g$.

$$P(g) = \frac{H(g)}{N}$$

Image Statistics: Multidimensional Histogram

- A histogram can be built from multiple images.
- E.g. from 2 color channels of the same image:
- The gray value in each pixel is used as the coordinate of the counter in 256 x 256 histogram image:



- The frequencies of occurrence are scaled and displayed with color palettes:

$$h(g_0, h_1, \dots, h_{N-1}) = \frac{a_{g_0 g_1 \dots g_{N-1}}}{N}$$

$$s(x, y) = s(g_0, g_1) = C \cdot h(g_0, h_1)$$

Image Statistics: Multidimensional Histogram

- A **2D-Histogram** can show:
 - **Over-exposure** of an image:

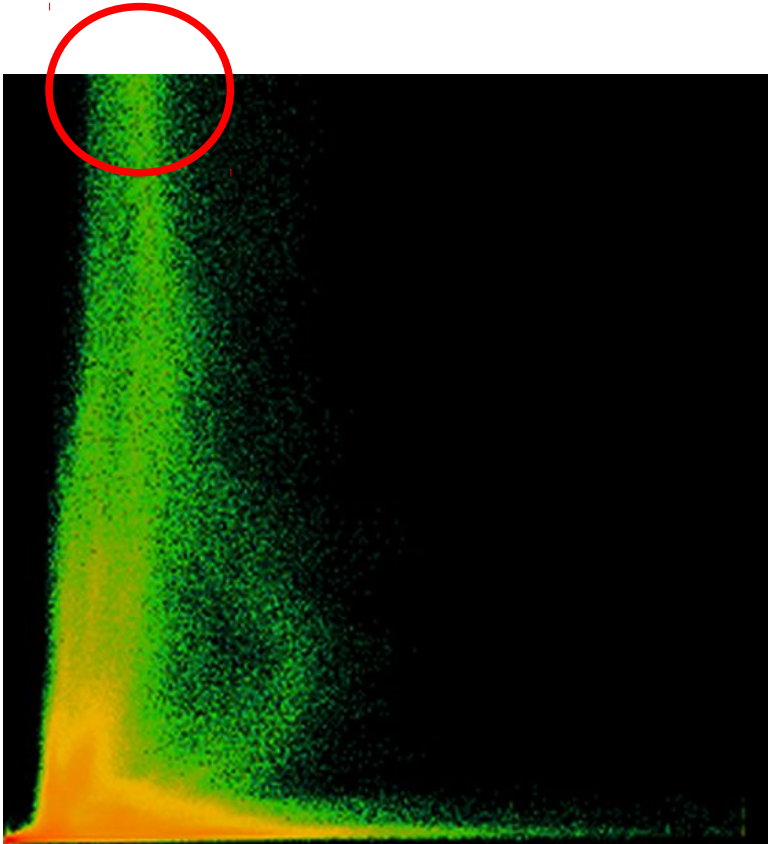


Image Statistics: Multidimensional Histogram

- A **2D-Histogram** can show:
 - Over-exposure of an image
 - **Correlation** between 2 images show in concentration along the diagonal:

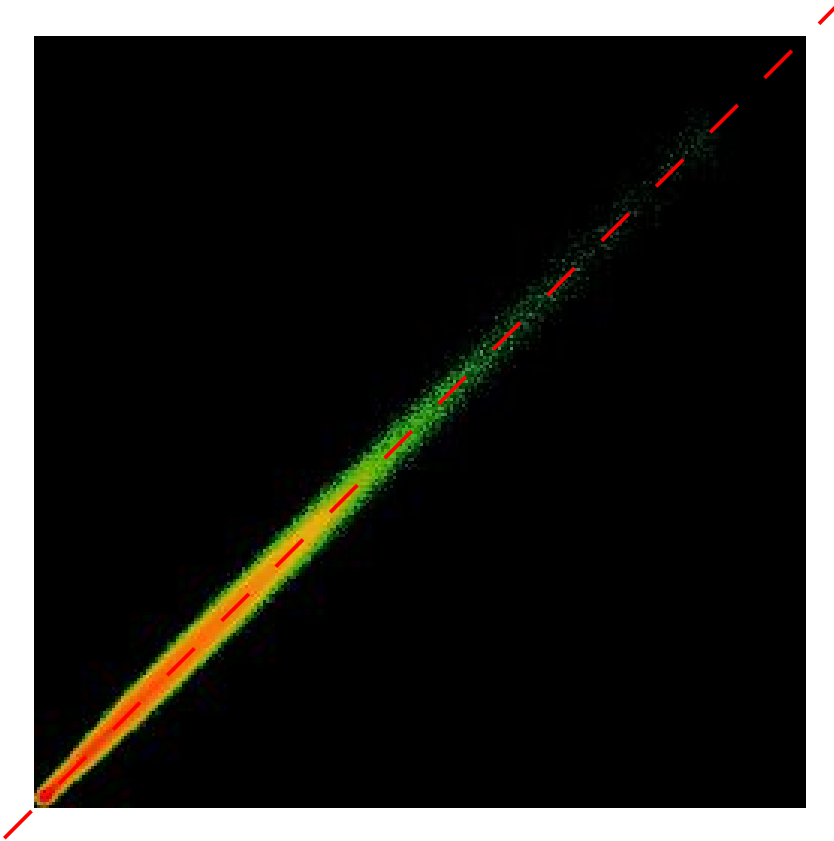


Image Statistics: Multidimensional Histogram

- A **2D-Histogram** can show:
 - Over-exposure of an image
 - Correlation between 2 images
 - **Distribution of Dynamic** in one color channel:

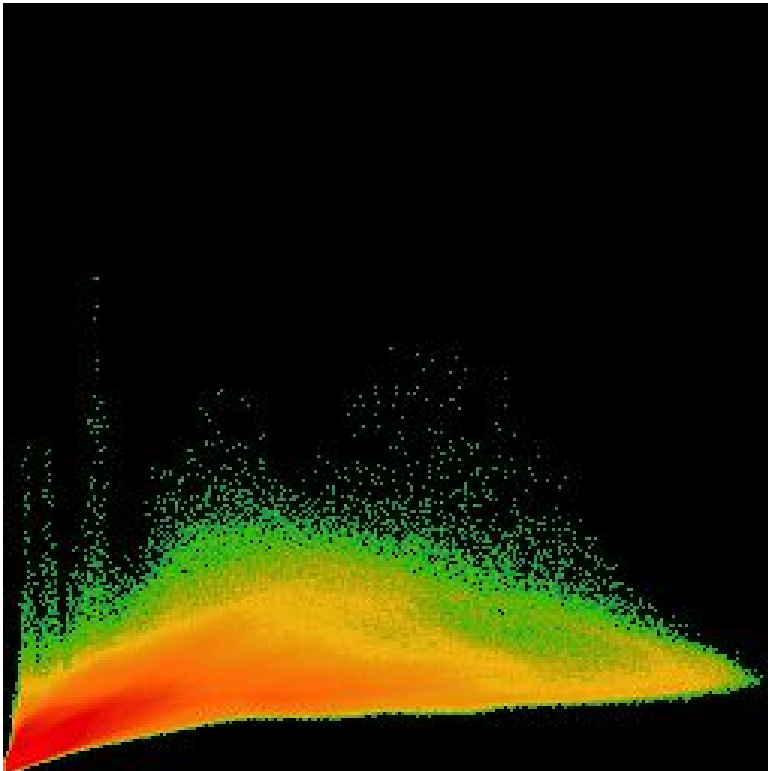


Image Statistics: Multidimensional Histogram

- A **2D-Histogram** can show:
 - Over-exposure of an image
 - Correlation between 2 images
 - Distribution of Dynamic
 - **Hot pixels** are single defect pixels that saturate without light:

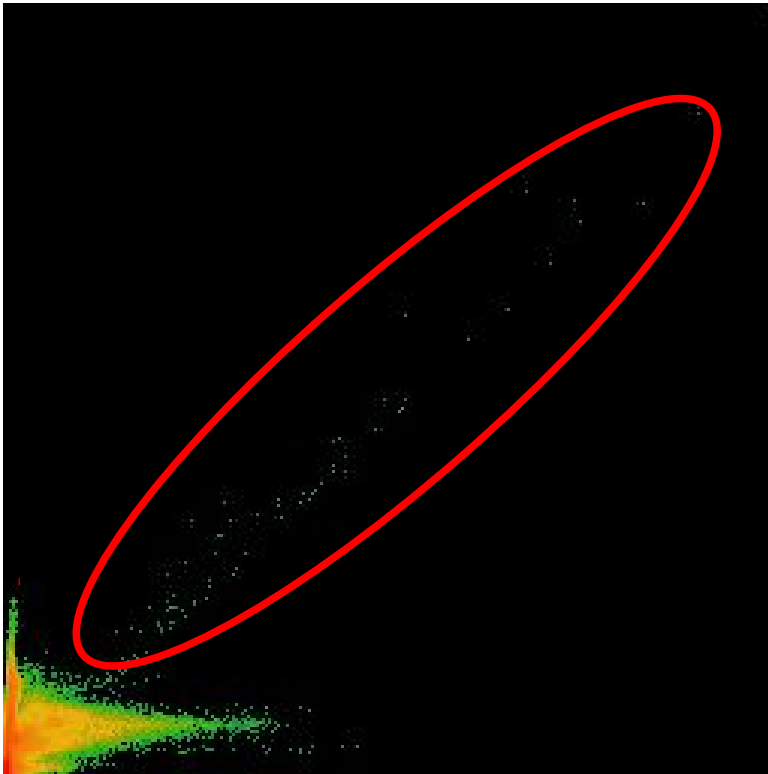


Image Statistics: Multidimensional Histogram

- Fiji can display also 3D histograms in the color inspector:

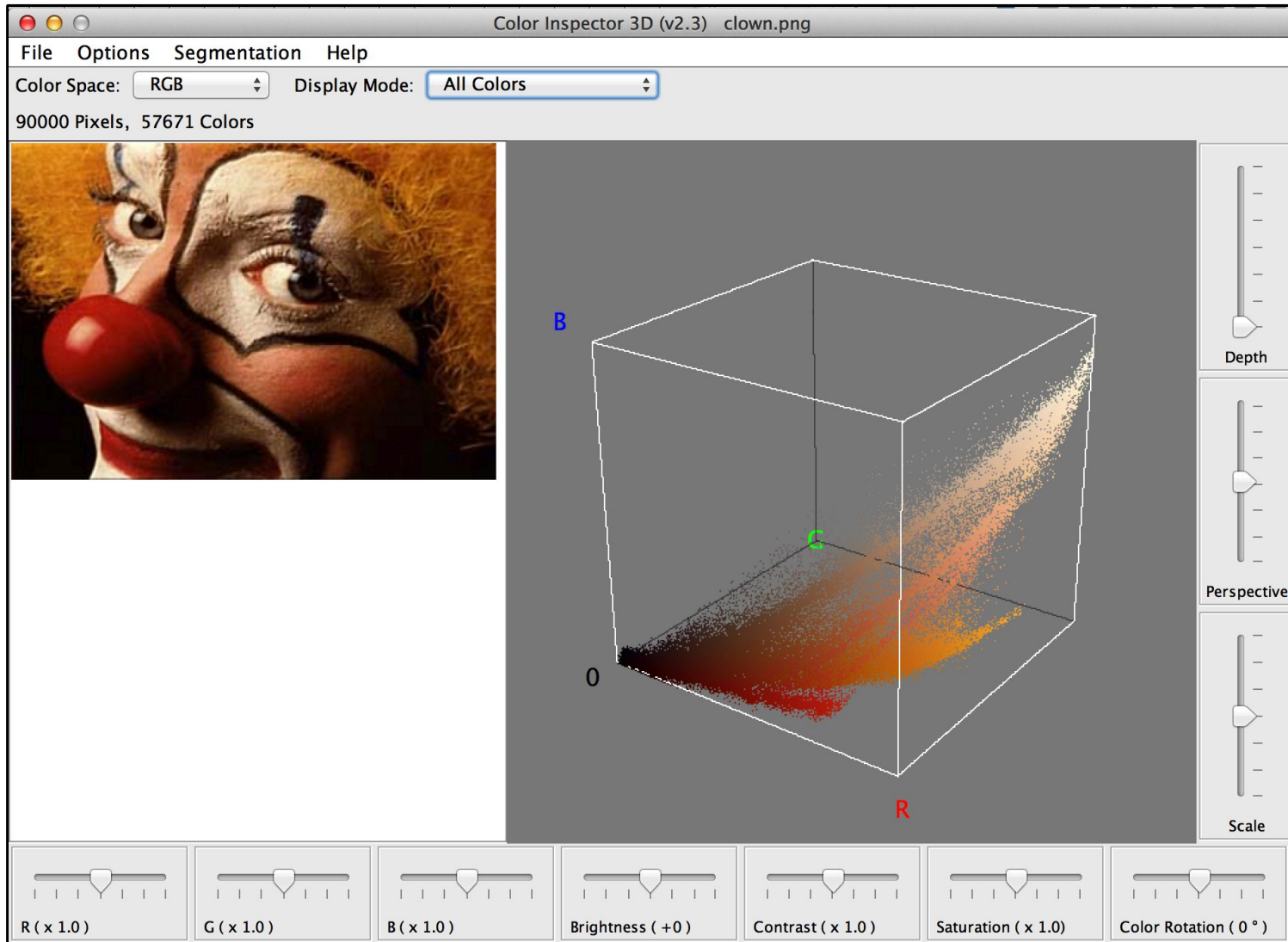
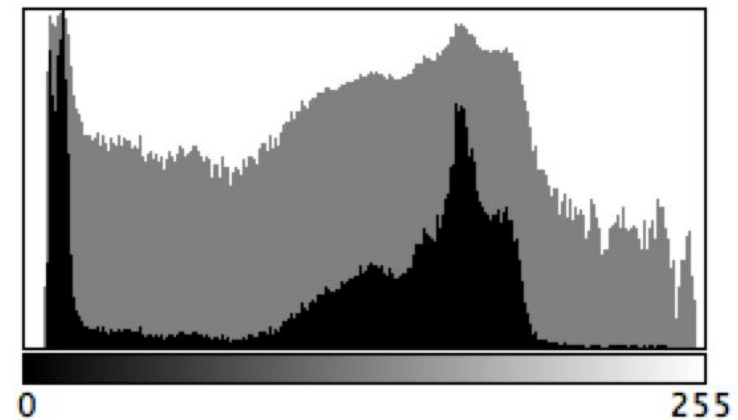


Image Statistics Values:

- **Min. & max.:** $D = g_{max} - g_{min}$
- **Contrast:** $C = \frac{g_{max} - g_{min}}{g_{max} + g_{min}}$
- **Mean (Mittelwert):** $\bar{g} = \frac{1}{N} \sum_{x=0}^{m-1} \sum_{y=0}^{n-1} g(x, y)$
- **Mode (Modalwert):** $\hat{g} = \max(h(g))$



Count: 65536	Min: 7
Mean: 118.724	Max: 253
StdDev: 62.342	Mode: 14 (1685)

Image Statistics Values:

- **Variance (Varianz):** $var = \frac{1}{N} \sum_{x=0}^{m-1} \sum_{y=0}^{n-1} (g(x, y) - \bar{g})^2$
- **Standard Deviation:** $s = \sigma = \sqrt{var}$

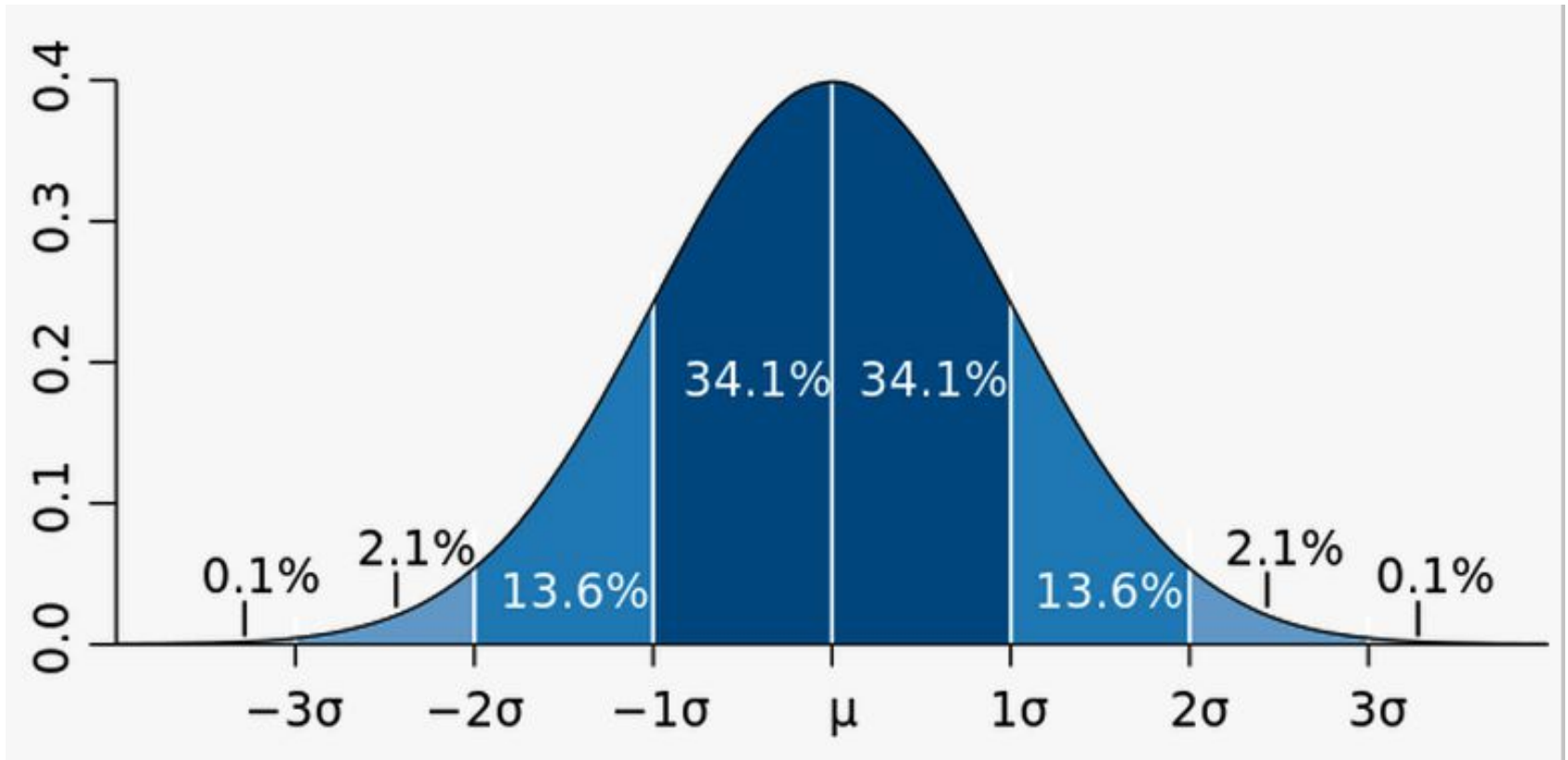


Image Statistics Values:

- **Skewness (Schiefe):**
$$v = \frac{1}{N} \sum_{x=0}^{m-1} \sum_{y=0}^{n-1} \left(\frac{g(x, y) - \bar{g}}{s} \right)^3$$

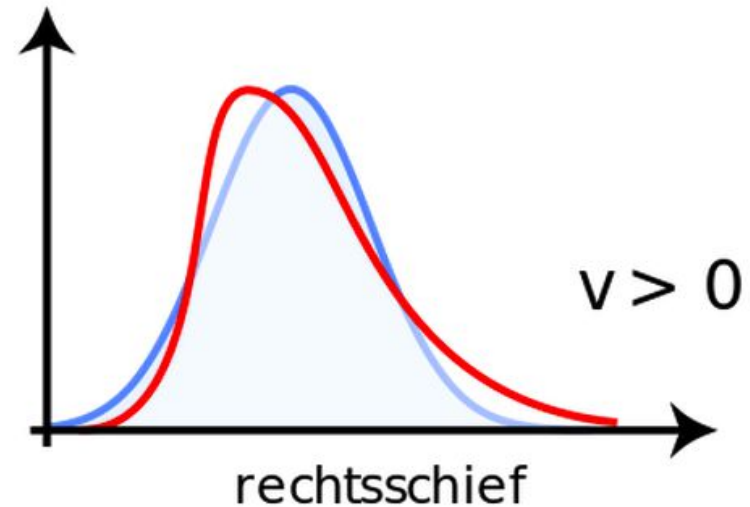
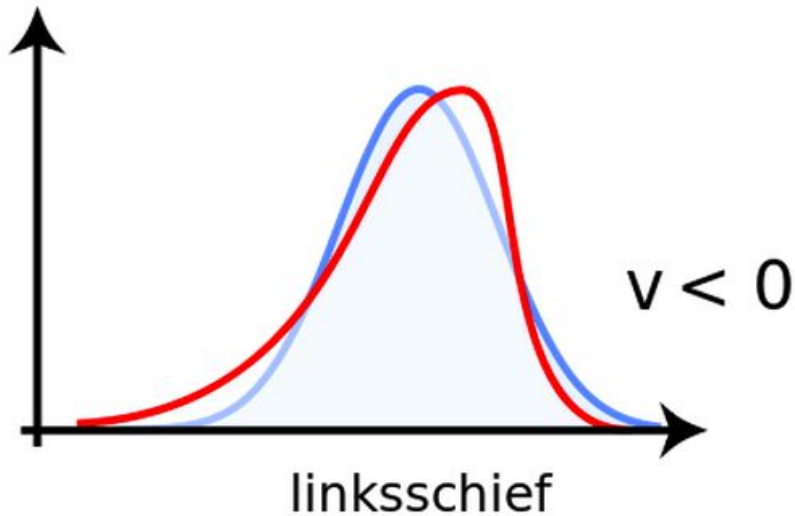


Image Statistics Values:

- **Kurtosis (Wölbung):** $w = \frac{1}{N} \sum_{x=0}^{m-1} \sum_{y=0}^{n-1} \left(\frac{g(x, y) - \bar{g}}{s} \right)^4$

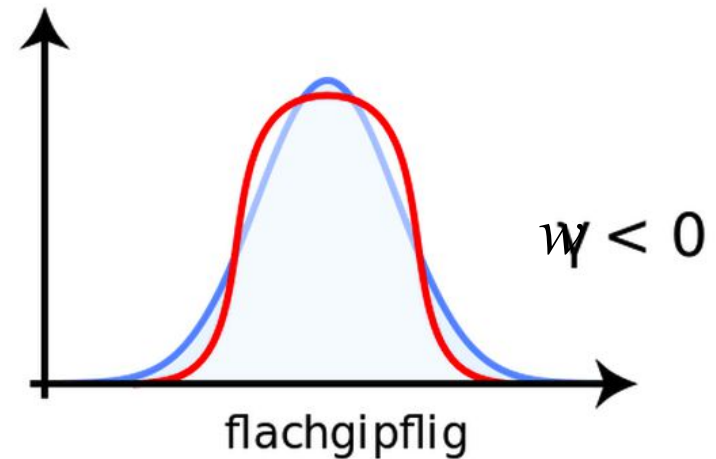
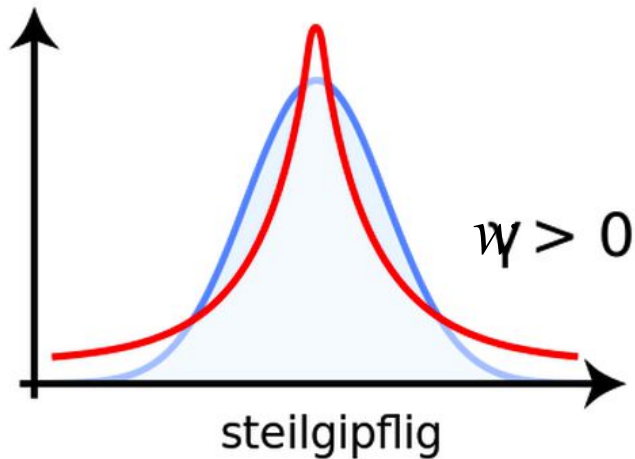


Image Statistics Values:

- **Entropy (Entropie):** $H = - \sum_{g=0}^{255} h(g) \log_2(h(g))$

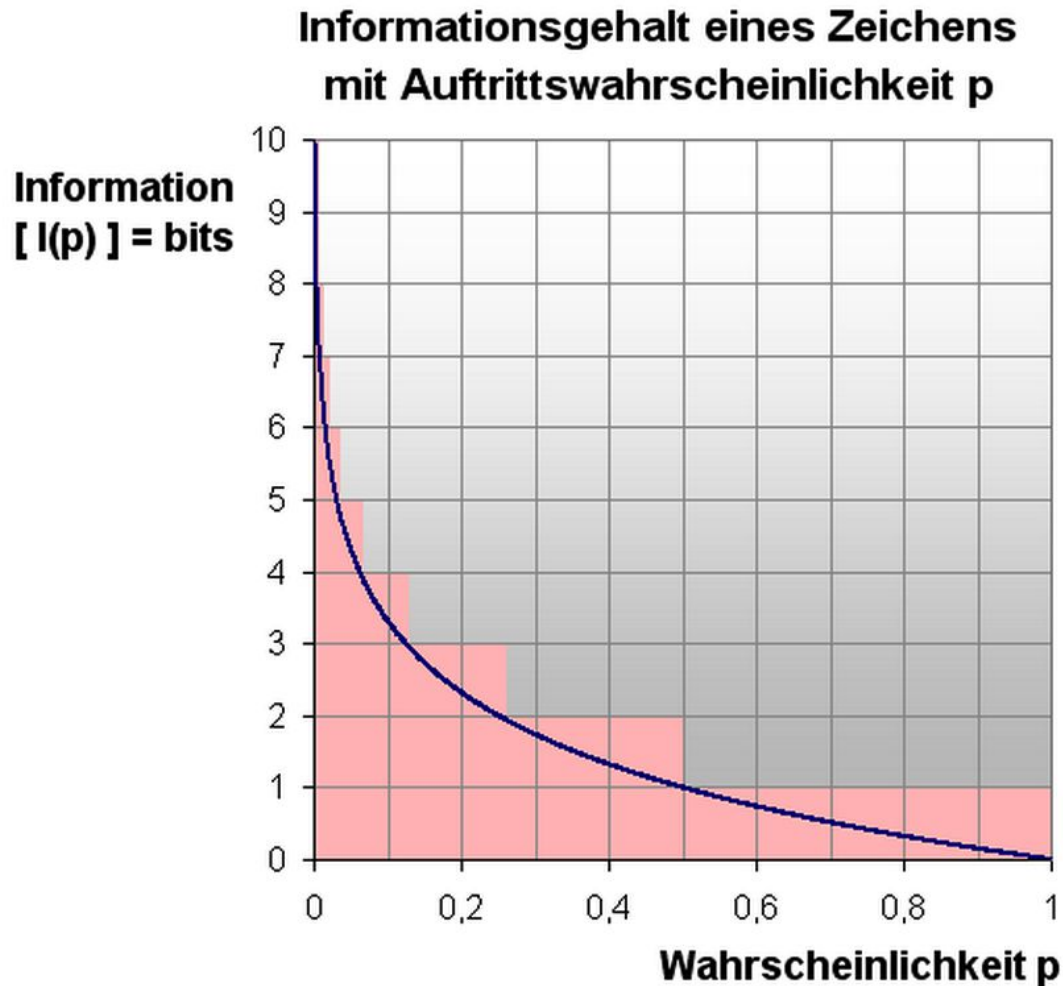


Image Statistics Examples:

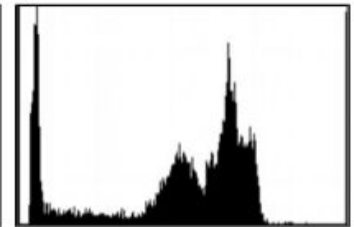
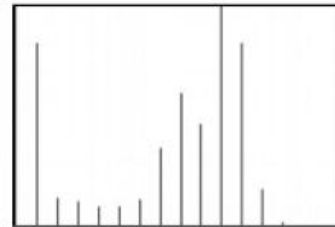
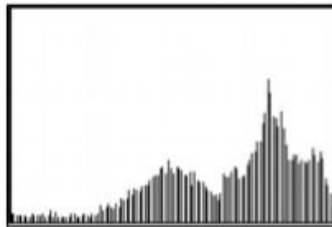
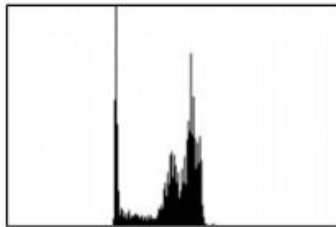
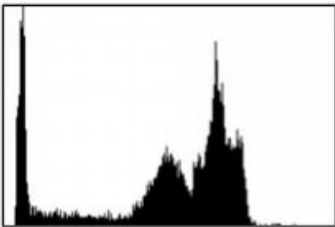
Originalbild

Kontrast
reduziert

Kontrast
erhöht

Graustufen
reduziert

Mit
Salt & Pepper



Min:	8	81	0	16	0
Max:	246	172	255	239	255
Dynamic:	238	91	255	223	255
Contrast:	0.94	0.36	1.00	0.87	1.00
Mean:	118.7	123.6	130.7	118.9	119.0
StdDev:	59.6	22.9	87.3	58.5	64.6
Mode:	14	83	0	159	14
Median:	138	131	150	143	138
Skewness:	-0.79	-0.79	-0.43	-0.77	-0.53
Kurtosis:	-0.81	-0.81	-1.29	-0.83	-0.73