



**Institute of
Applied Physics**

Friedrich-Schiller-Universität Jena

Optical Metrology and Sensing

Lecture 1-2: Introduction

2020-11-03

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- Errors of measurements
- Sampling theorem



Measurement Errors

- Measurement results:
Result of measurement = measured value \pm uncertainty
- Selection of error types:
 1. material measures
 2. mechanical 'failures' of the system
 3. distortion of Abbe comparator principle
 4. environmental influences
 5. experimenter / observer
- Systematic and random errors:
Systematic errors: correction of the measured value possible (calibration).
Can be reproduced and are constant in amount and sign.
Random errors and systematic errors with unknown sign: uncertainty of measurement

- Propagation of errors:

1. systematic errors:

$$df = \frac{\partial f}{\partial x} dx + \frac{\partial f}{\partial y} dy + \frac{\partial f}{\partial z} dz$$

2. statistical errors:

$$u = \pm \sqrt{\left(\frac{\partial f}{\partial x}\right)^2 (dx)^2 + \left(\frac{\partial f}{\partial y}\right)^2 (dy)^2 + \left(\frac{\partial f}{\partial z}\right)^2 (dz)^2}$$

- Scattering of values by repeating the measurements
- Distribution of errors:
Repeatability, width 6σ
- Expected value:
average for large number of repeated measurements

$$\bar{x} = \lim_{N \rightarrow \infty} \frac{1}{N} \sum_{j=1}^N x_j$$

$$\sigma^2 = \frac{1}{N} \sum_{j=1}^N (x_j - \bar{x})^2$$

- Variance:

- Standard deviation
root mean square (rms):

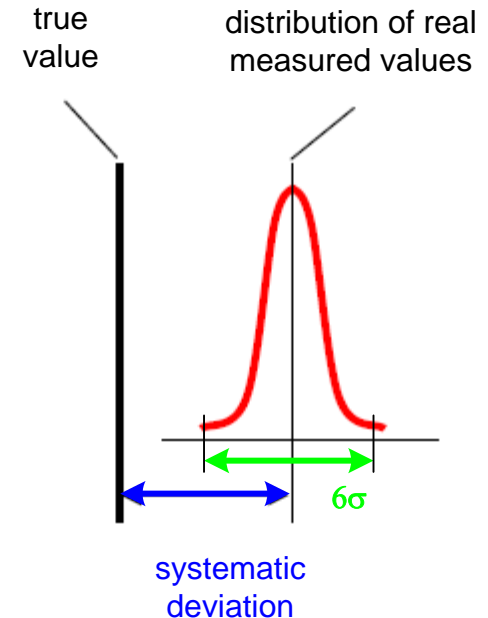
$$\sigma = \sqrt{\frac{1}{N} \sum_{j=1}^N (x_j - \bar{x})^2}$$

- Higher order moments:
1. Skewness, kurtosis

$$K = \frac{1}{N} \sum_{j=1}^N (x_j - \bar{x})^3$$

- 2. Peakedness

$$P = \frac{1}{N} \sum_{j=1}^N (x_j - \bar{x})^4$$





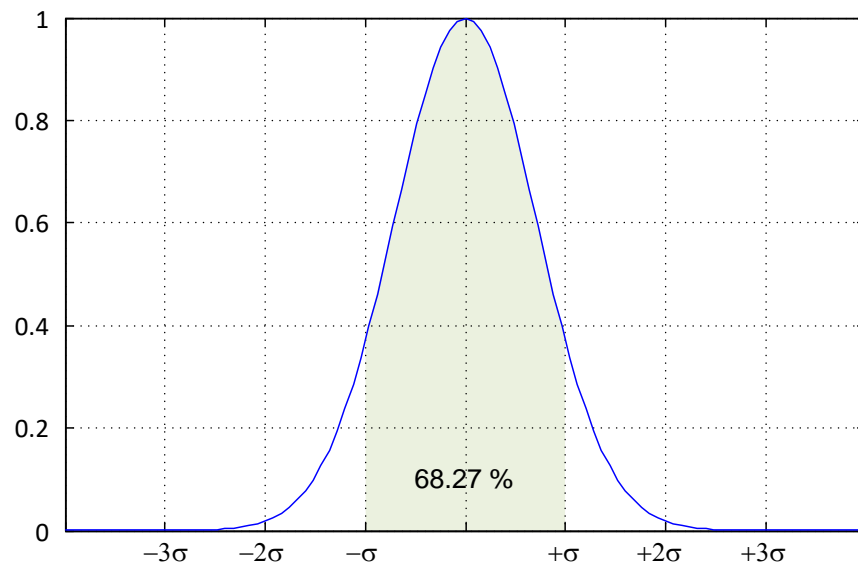
Distribution of Statistical Errors

- Gaussian or Normal Distribution: $p = e^{-x^2}$

Within interval $\pm \sigma$ are **68.27 %** \forall measured values (statist. certainty: 68.27 %)

Within interval $\pm 2\sigma$ are **95.45 %** \forall measured values (statist. certainty: 95.45 %)

Within interval $\pm 3\sigma$ are **99.73 %** \forall measured values (statist. certainty: 99.73 %)



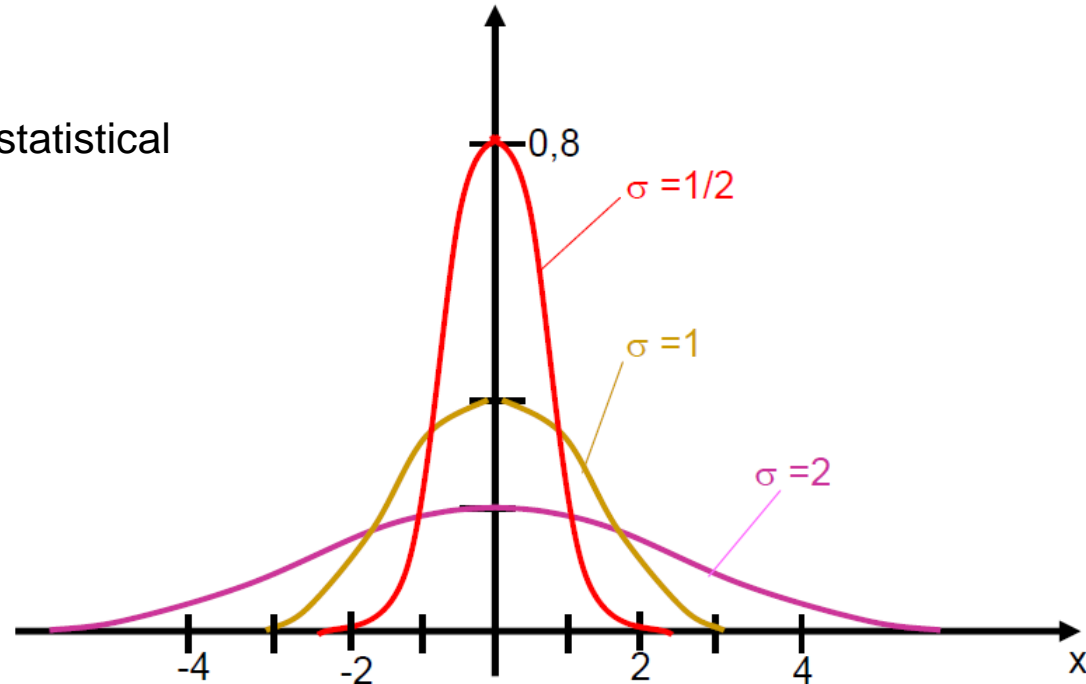
- For a given statistical certainty the corresponding range is called $\pm c \sigma$ confidence interval (CI)
The true value lies within the confidence interval for a given statistical certainty if there are no systematic errors



Distribution of Statistical Errors

- Gaussian or Normal distribution
- Idealized model function for purely statistical influences
- Standardized formulation

$$G(x, \bar{x}, \sigma) = \frac{1}{\sqrt{2\pi} \cdot \sigma} \cdot e^{-\frac{(x-\bar{x})^2}{2\sigma^2}}$$



- Inversion: error function:
Probability, that the variable t
lies within the intervall $-z \dots +z$
(interval of confidence, integral)
Examples: $p = 0.683$ for $z = \sigma$
 $p = 0.5$ gives interval $z = 0.6745 \sigma$

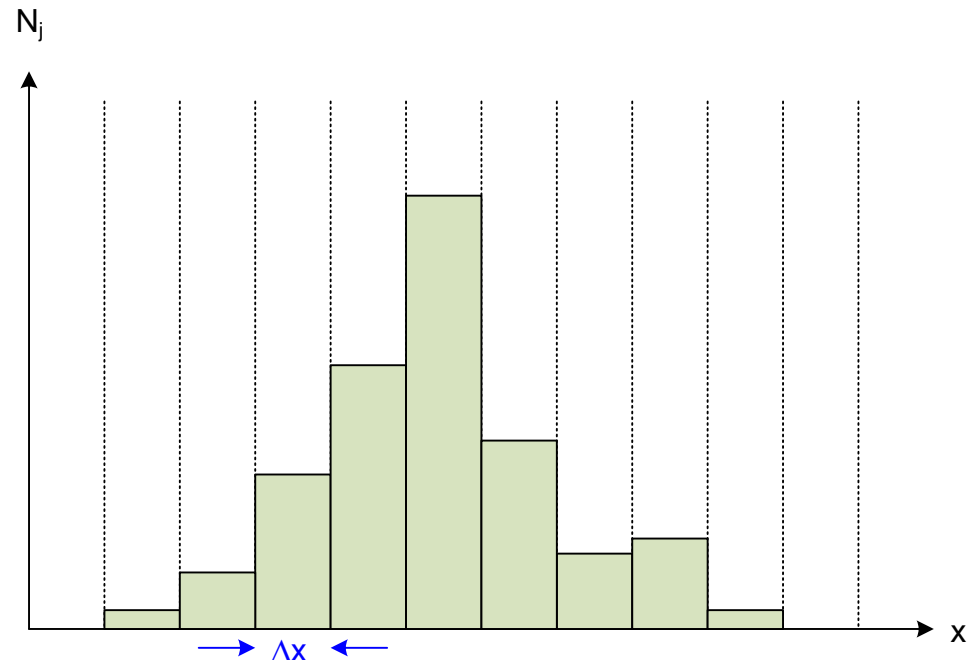
$$t = \frac{x - \bar{x}}{\sigma}$$

$$p = \text{erf}(z) = \frac{2}{\sqrt{2\pi}} \int_0^z e^{-\frac{t^2}{2}} dt$$



Distribution of Statistical Errors

- Probability, that the value is outside the confidence interval (failure):
 $a = 1 - p$
- N measurements:
Standard deviation of the mean is reduced to
$$\bar{\sigma} = \frac{\sigma}{\sqrt{N}}$$
- Confidence range of the mean
Example: $K = 1$: confidence $\pm\sigma$
 $a = 0.3174$
$$C = K \cdot \frac{\sigma}{\sqrt{N}}$$
- Histogram of values for N repeated measurements:
Number N_j of results inside the same interval



- Trend of measurement data as a function of a variable x

$$y_i = m \cdot x_i + b$$

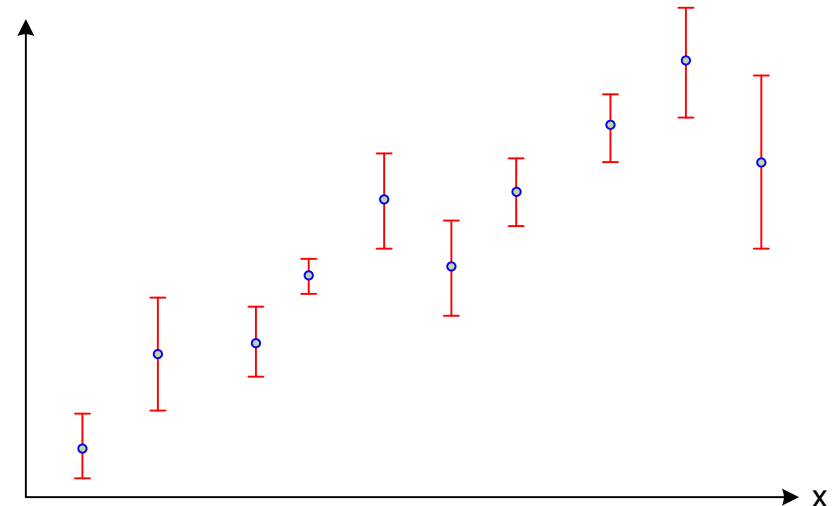
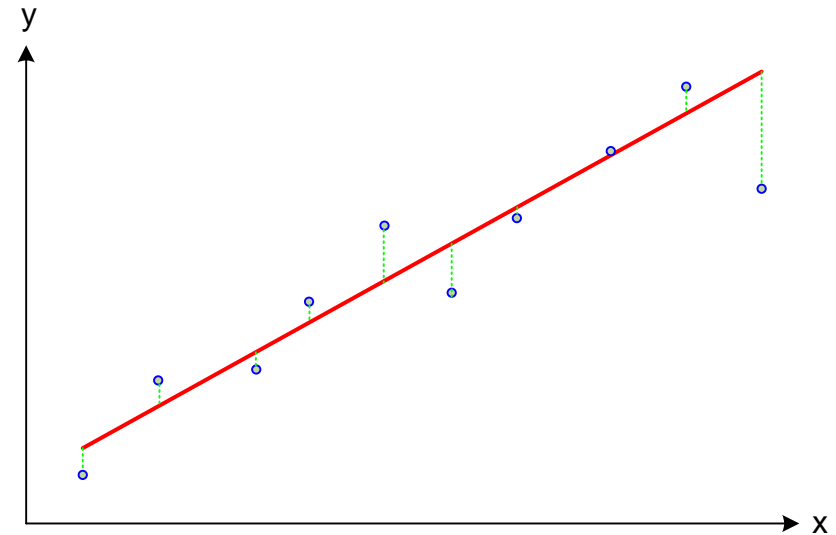
- Calculation of slope (LSQ fit)

$$m = \frac{\sum_i y_i \cdot (x_i - \bar{x})}{\sum_i (x_i - \bar{x})^2}$$

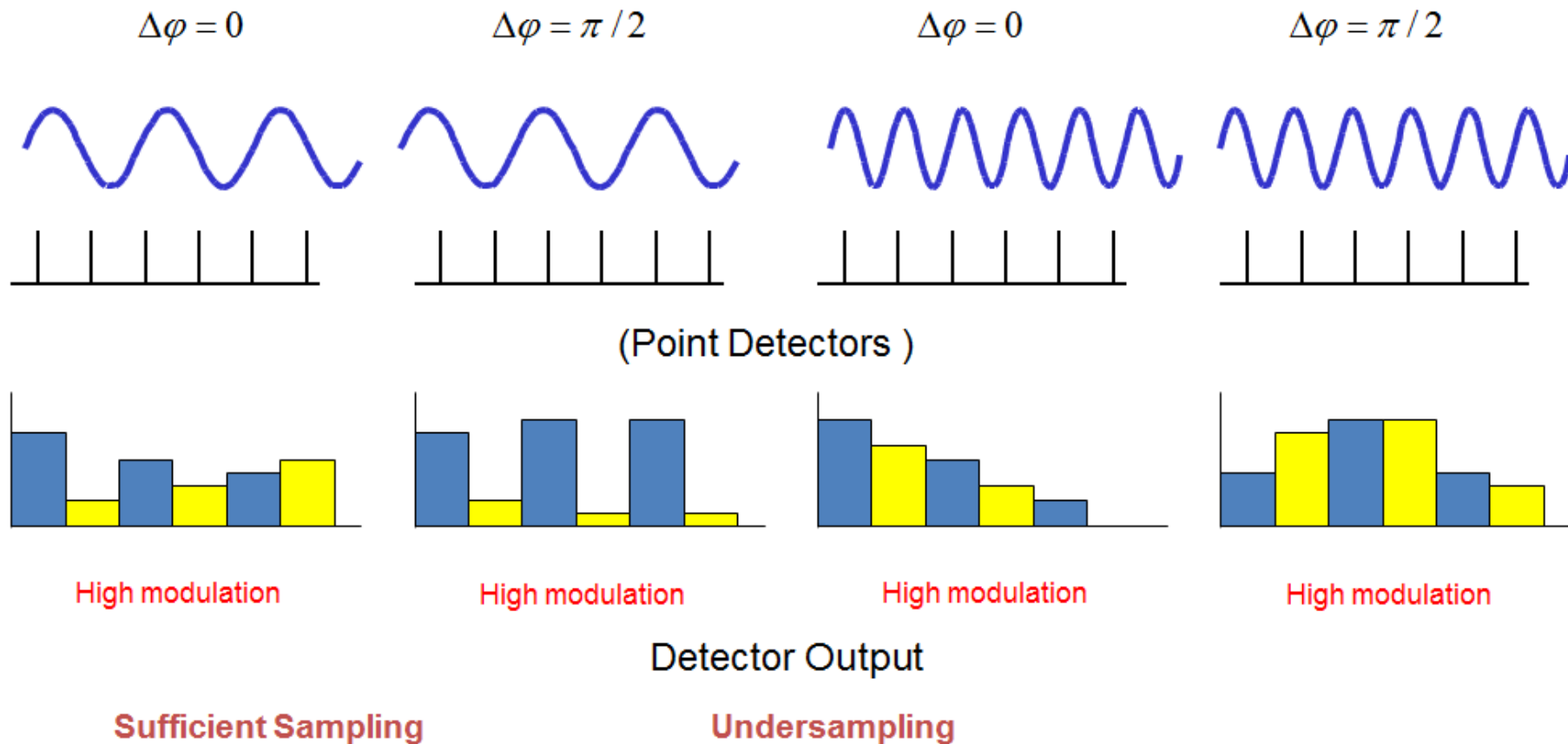
- Absolute value / constant

$$b = \bar{y} - m \cdot \bar{x}$$

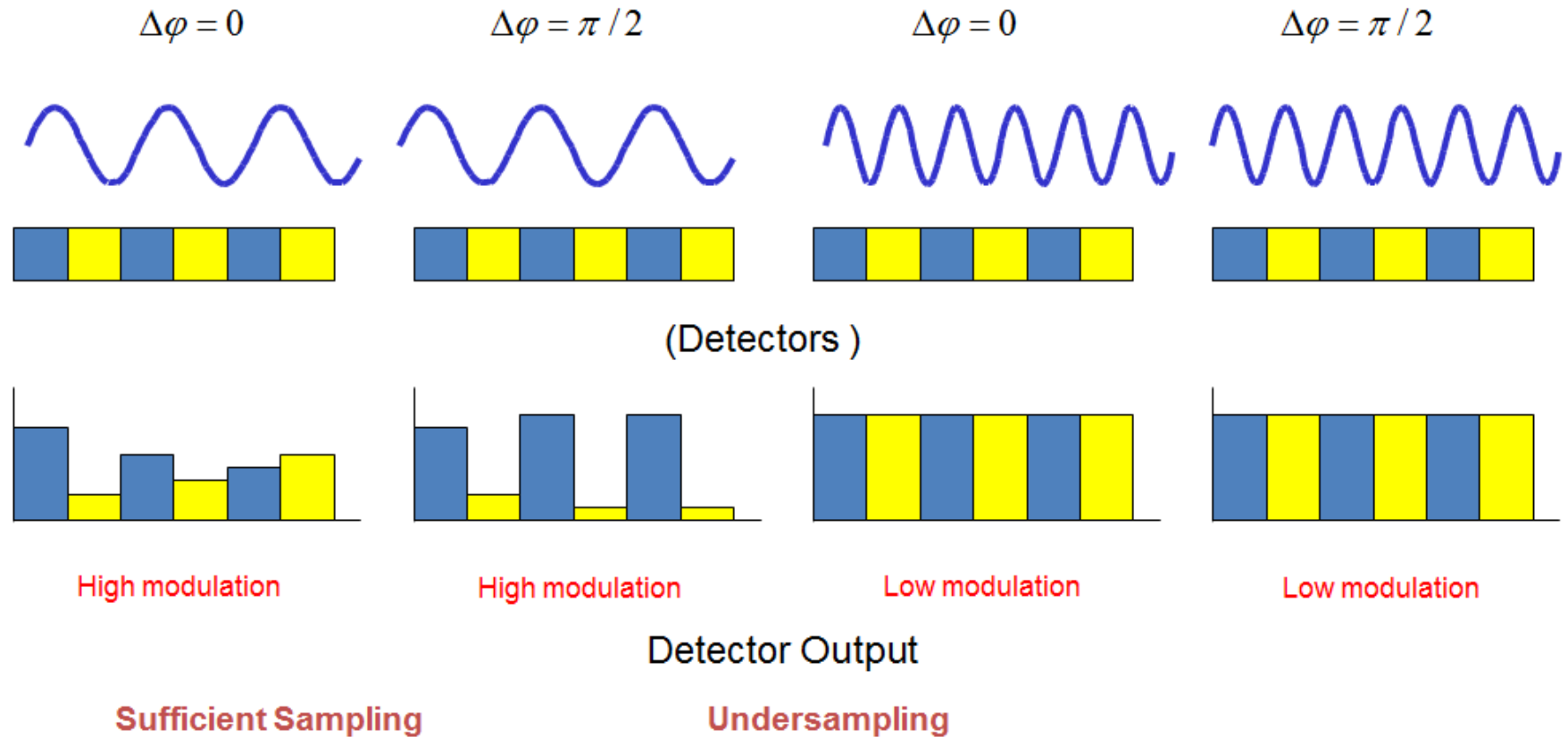
- Special aspects:
weighting of point inversely to error bars



- Point detector



- Detector of finite Size



- Fourier transform

$$f(v) = \int_0^{x_{\max}} F(x) \cdot e^{-2\pi \cdot i \cdot v \cdot x} dx$$

- Relation for discrete Fourier transform

$$\Delta x \cdot \Delta v = \frac{1}{N}$$

Frequency sampling depends on spatial sampling

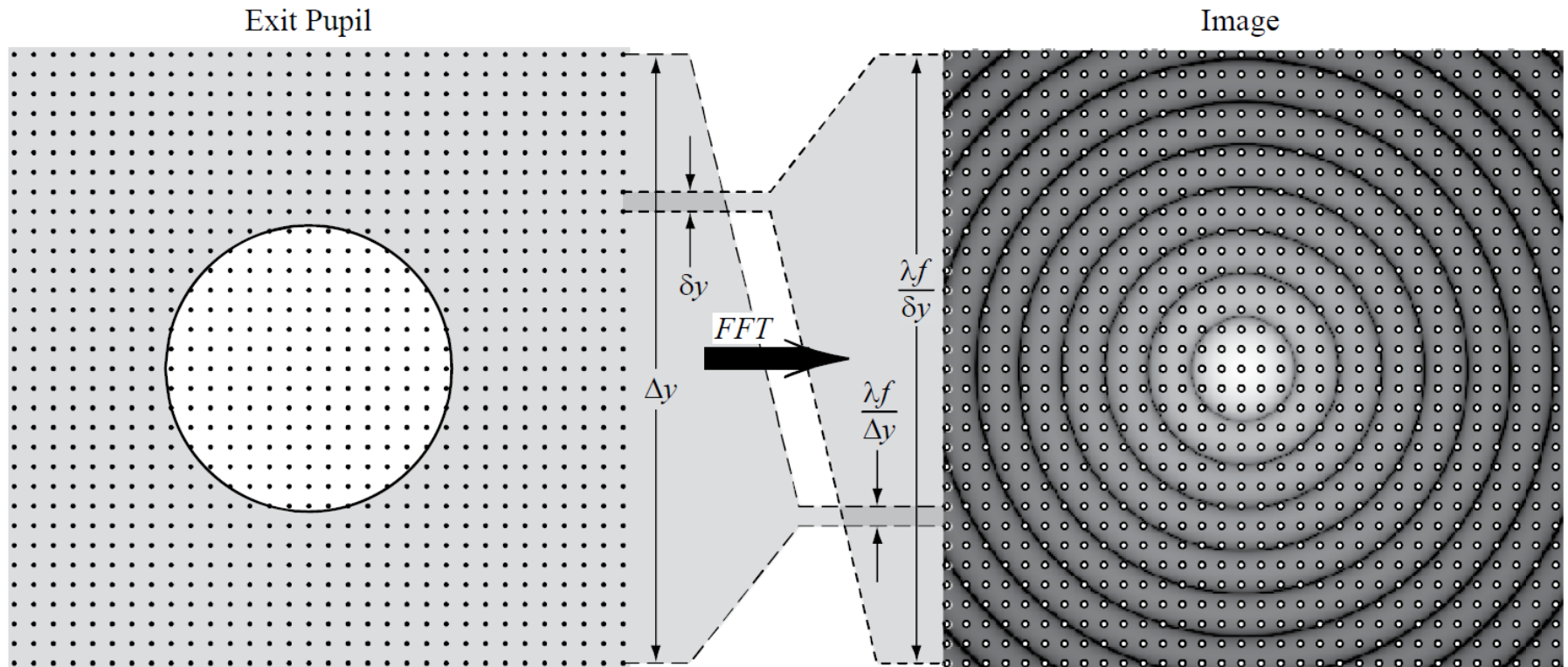
$$\Delta v = \frac{2v_{\max}}{N} = \frac{1}{x_{\max}}$$

- Discrete sampling:
 - periodicity in frequency space, limits bandwidth at Nyquist frequency
 - 2 points per period necessary to avoid aliasing

$$2v_{\max} = 2v_{Ny} < \frac{1}{\Delta x}$$

Sampling PSF Calculation

- PSF calculation by FFT:
 - coupling of coordinates in Pupil and image
 - zero-guard band necessary to get enough significant points in the PSF



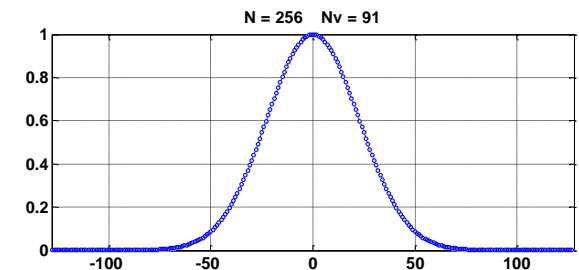
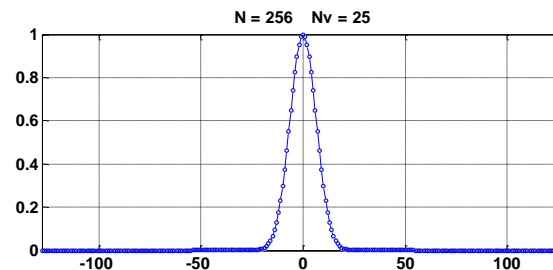
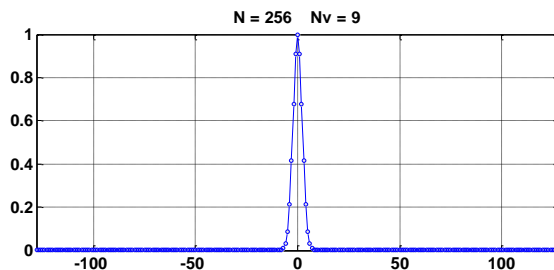
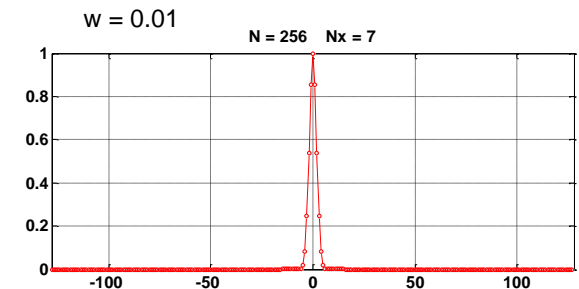
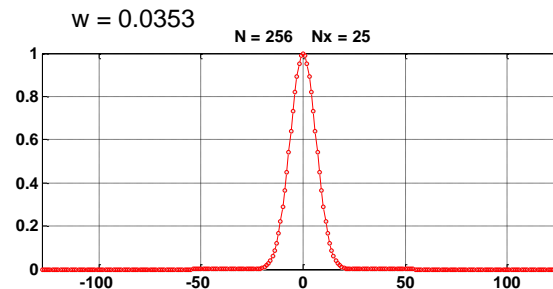
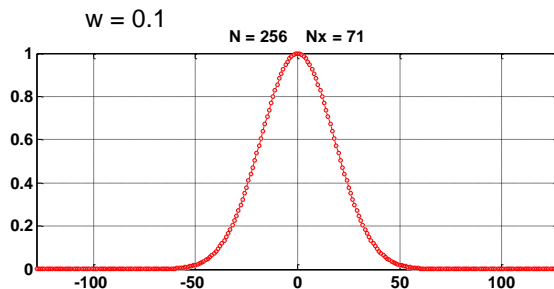
FFT-Sampling of a Gaussian Profile

- Gaussian profile in the spatial domain
- Fourier transform
- Sampling theorem
N: number of discrete points
D: size of calculation domain
- Zero padding with large D/w:
finer pixels in frequency space

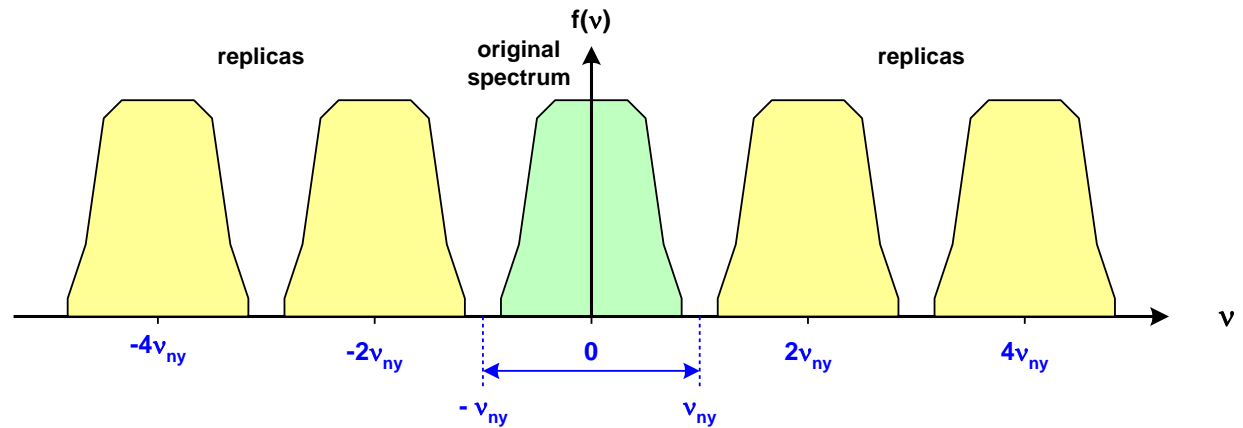
$$f(x) = e^{-\frac{x^2}{w_x^2}}$$

$$F(v) = w_x \sqrt{\pi} \cdot e^{-\pi^2 w_x^2 v^2} = w_x \sqrt{\pi} \cdot e^{-\frac{v^2}{w_v^2}} \quad w_v = \frac{1}{\pi \cdot w_x}$$

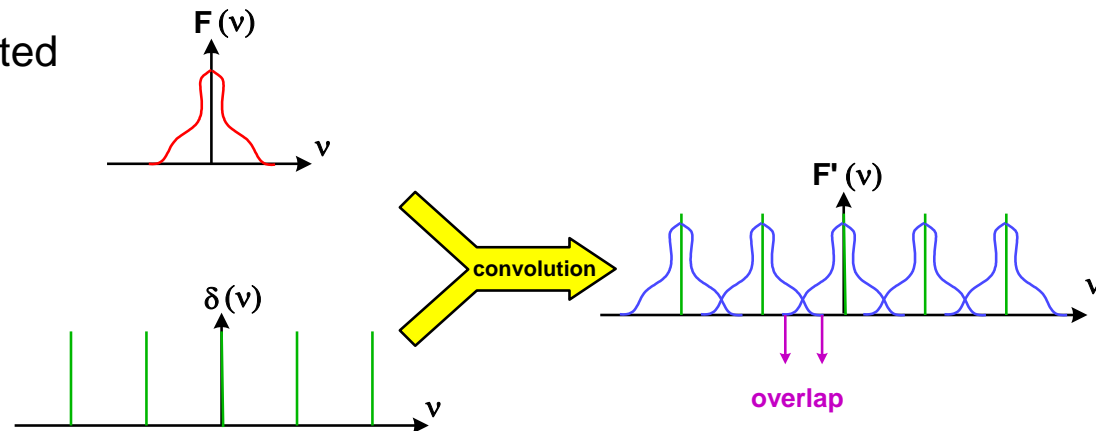
$$D = N \cdot \Delta x \quad , \quad v_{\max} = \frac{N}{D} = N \cdot \Delta v \quad , \quad \Delta v = \frac{1}{D}$$



- Periodic spectra must be separated



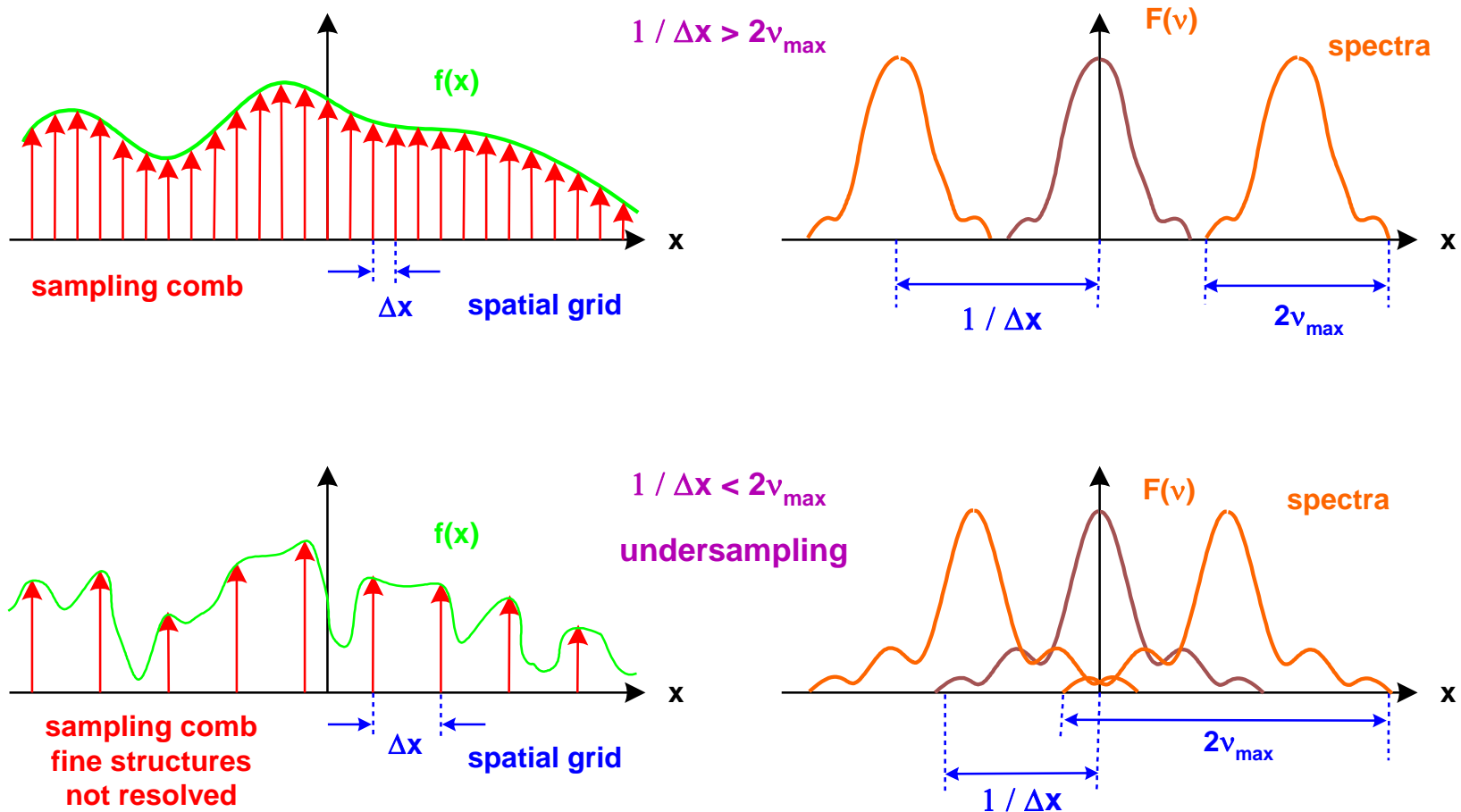
- Overlapp of spectra:
 - aliasing
 - pseudo pattern and Moire generated



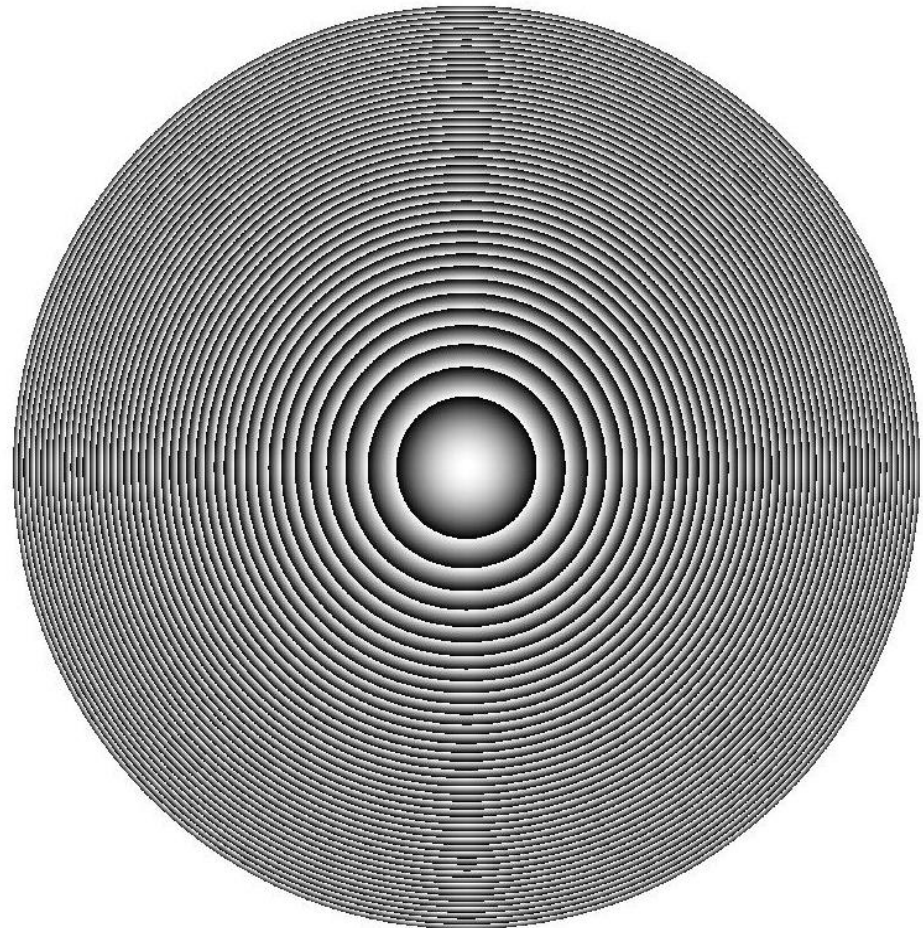
Sampling Theorem



- Necessary sampling in spatial domain to separate spectra in frequency domain
- Comb function creates periodicity



- Discrete ring pattern
- Circular aliasing patterns in outer region



- Digital discrete signal in spatial domain
comp function as sampling

$$\tilde{F}(x) = F(x) \cdot \text{comb}\left(\frac{x}{\Delta x}\right)$$

- Signal band-limited
finite extend in spatial domain

$$\tilde{\tilde{F}}(x) = \tilde{F}(x) \cdot \text{rect}\left(\frac{x}{x_{\max}}\right) = F(x) \cdot \text{comb}\left(\frac{x}{\Delta x}\right) \cdot \text{rect}\left(\frac{x}{x_{\max}}\right)$$

- Back-transform
sampling corresponds to convolution
with sinc-function

$$F(x) = \tilde{\tilde{F}}(x) \cdot \text{comb}\left(\frac{x}{\Delta x}\right) * \frac{1}{\Delta x} \cdot \frac{\sin\left(\pi \cdot \frac{x}{\Delta x}\right)}{\pi \cdot \frac{x}{\Delta x}}$$

$$F(x) = \tilde{\tilde{F}}(x) * R(x)$$

- Ideal reconstructor:
sinc function

$$R(x) = \frac{\sin(\pi \cdot \nu_{ny} \cdot x)}{\pi \cdot \nu_{ny} \cdot x} = \text{sinc}(\pi \cdot \nu_{ny} \cdot x)$$

Sampling of Bandlimited Signals



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