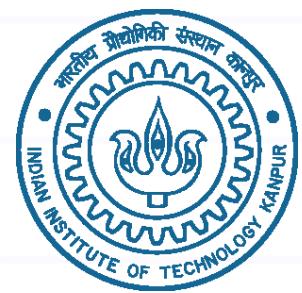


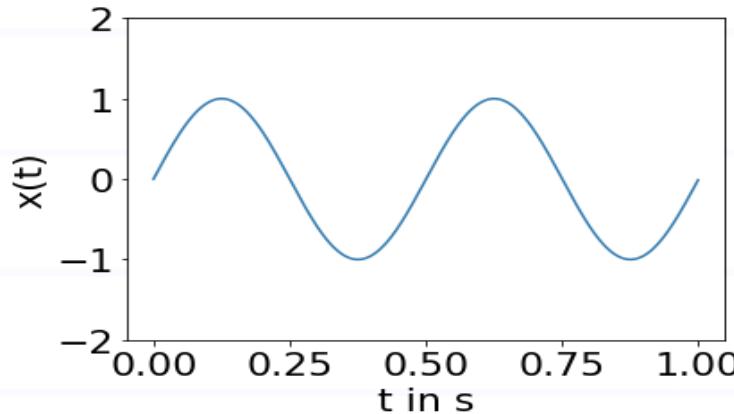
Digital Signal Processing-II

EE698V - Machine Learning for Signal Processing

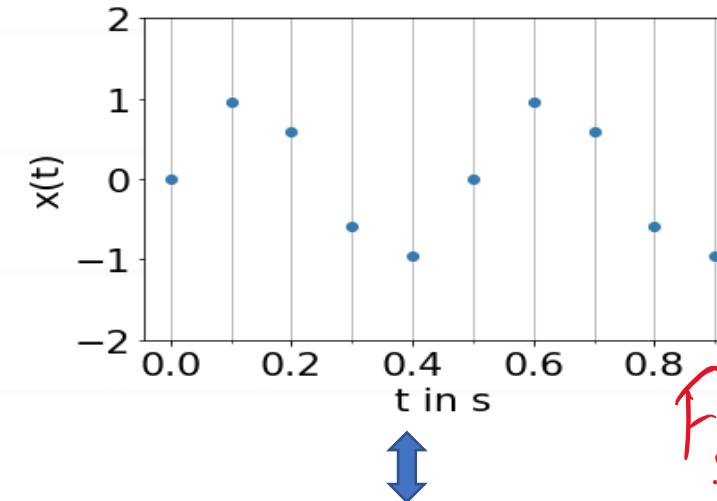
Vipul Arora



Sampling and Quantization



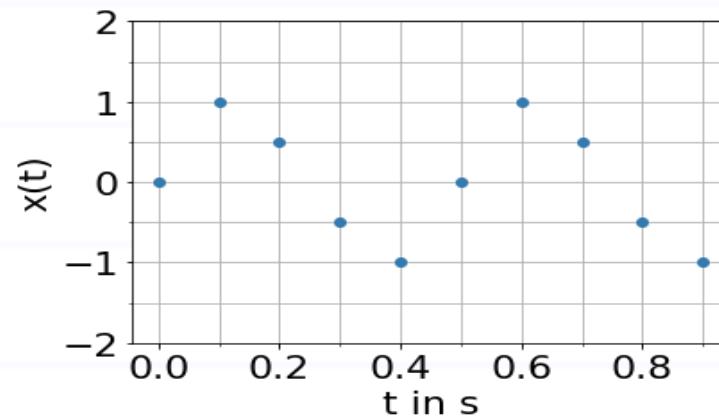
SAMPLE
→



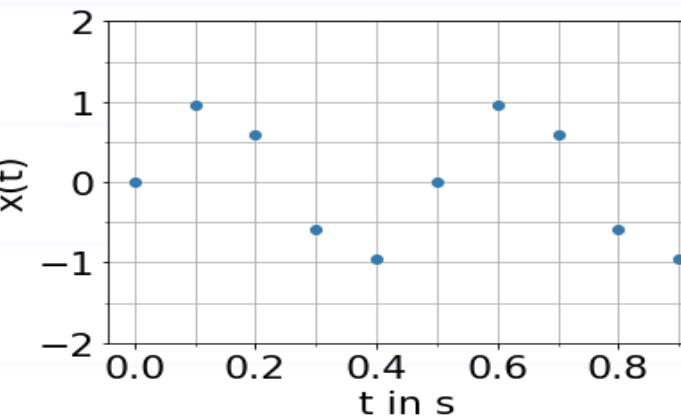
3.142...
8

3.1

$$F_s = 10/\delta$$



QUANTIZE
←



$$f = 2 \text{ cpl sw}$$

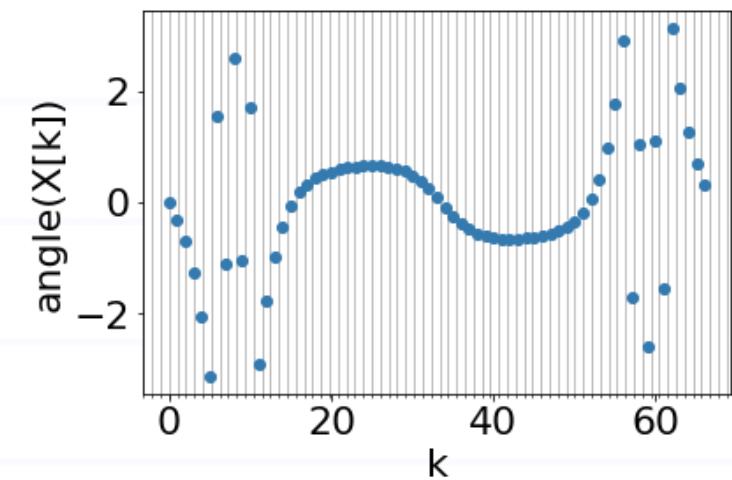
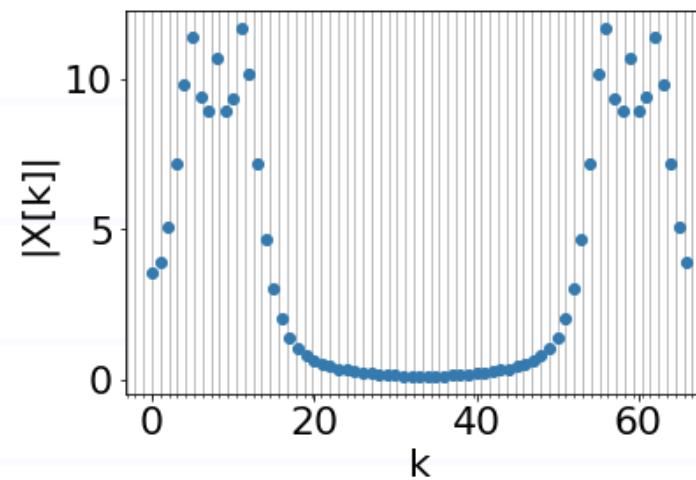
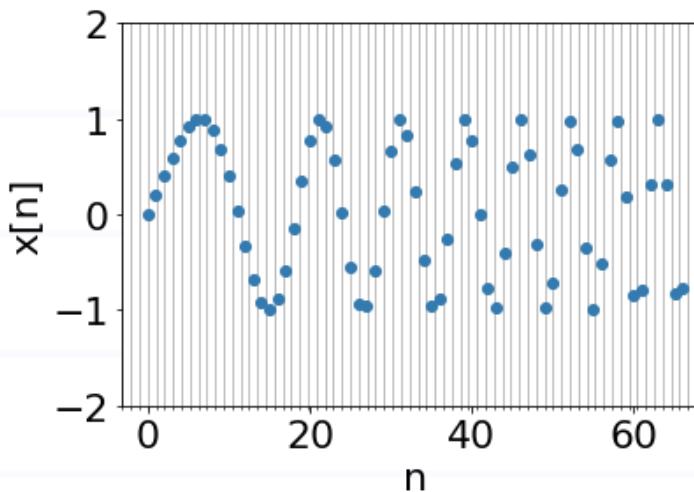
$$f = 2c/\delta$$

Sampling

- Sampling rate, $F_s = 1/T_s$
- How small a sampling rate can we choose?
 - We need at least 2 samples in a cycle to represent a frequency
 - Nyquist rate = $2*F_0$
- What is the highest frequency we can represent, given F_s ?
 - $F_{max} = F_s/2$

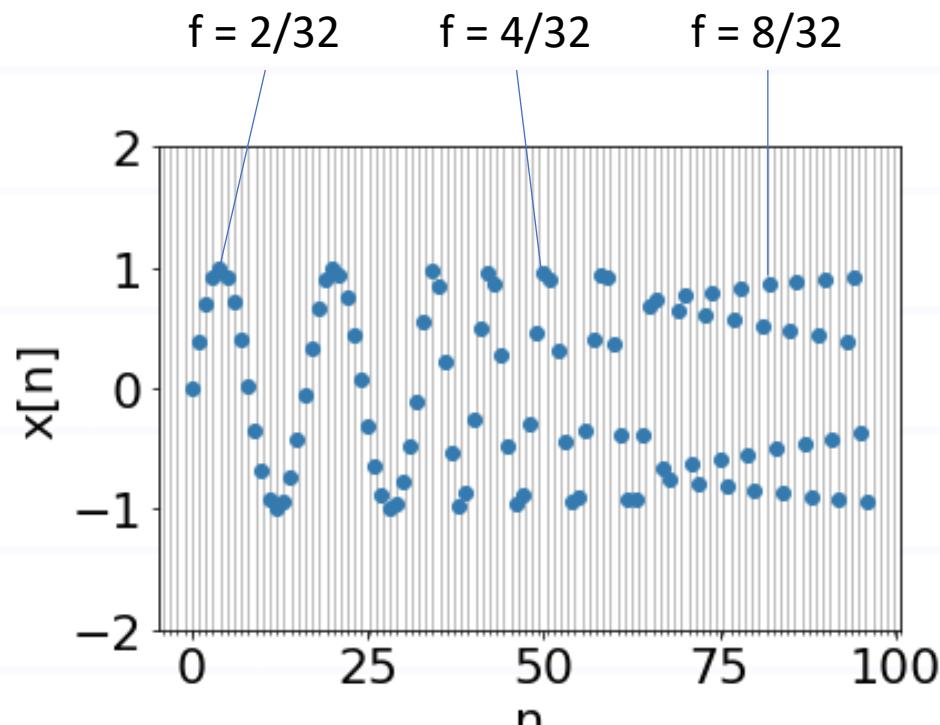
Discrete Fourier Transform

- This representation is valid if the signal is stationary, i.e., its characteristics do not change with time
- How about a non-stationary signal? a mess?

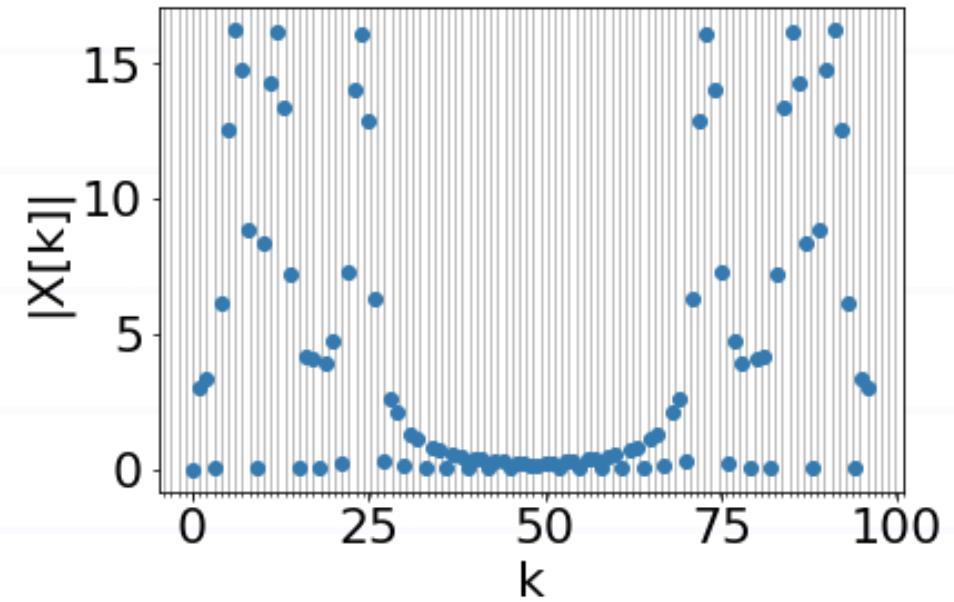


$x[n] = \sin(2\pi * f * n)$; where, f varies from $2/32$ to $8/32$ linearly with n

Discrete Fourier Transform



$$x[n] = \sin(2\pi * f * n)$$

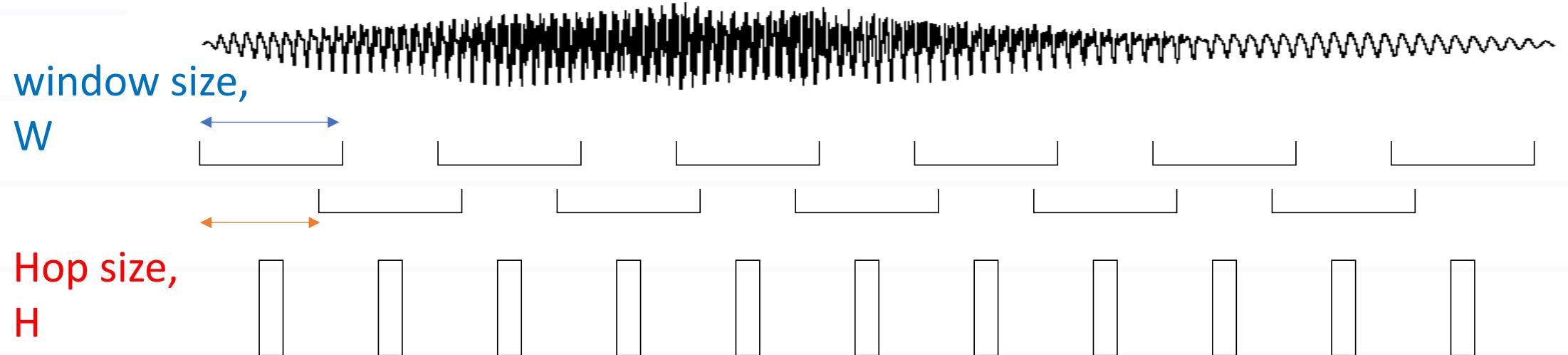


A Quasi-stationary Signal

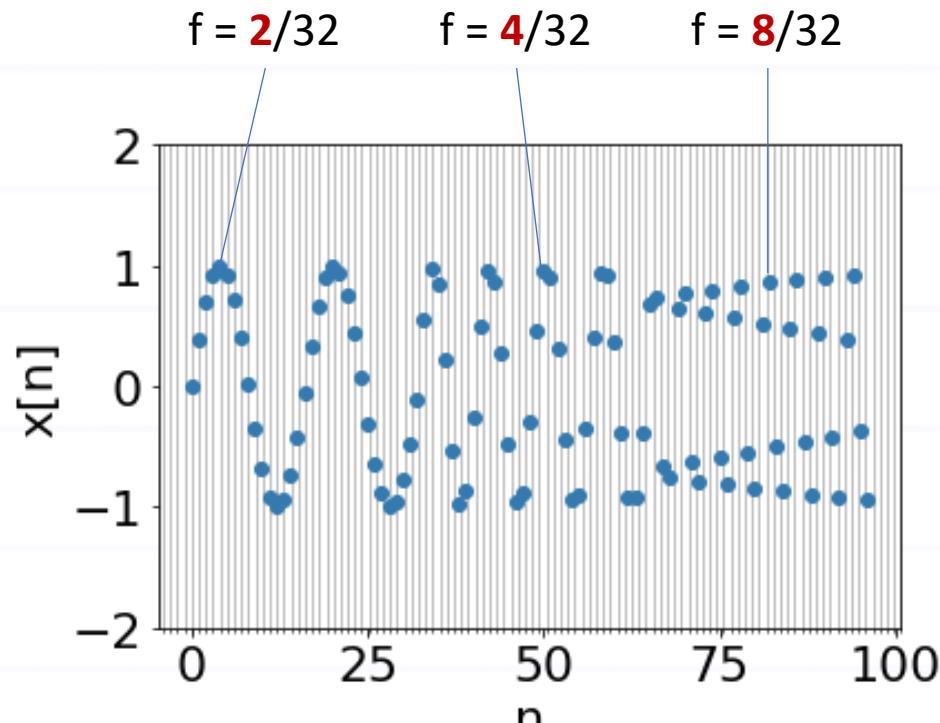
almost stationary in small intervals

Short-time Fourier Transform (STFT)

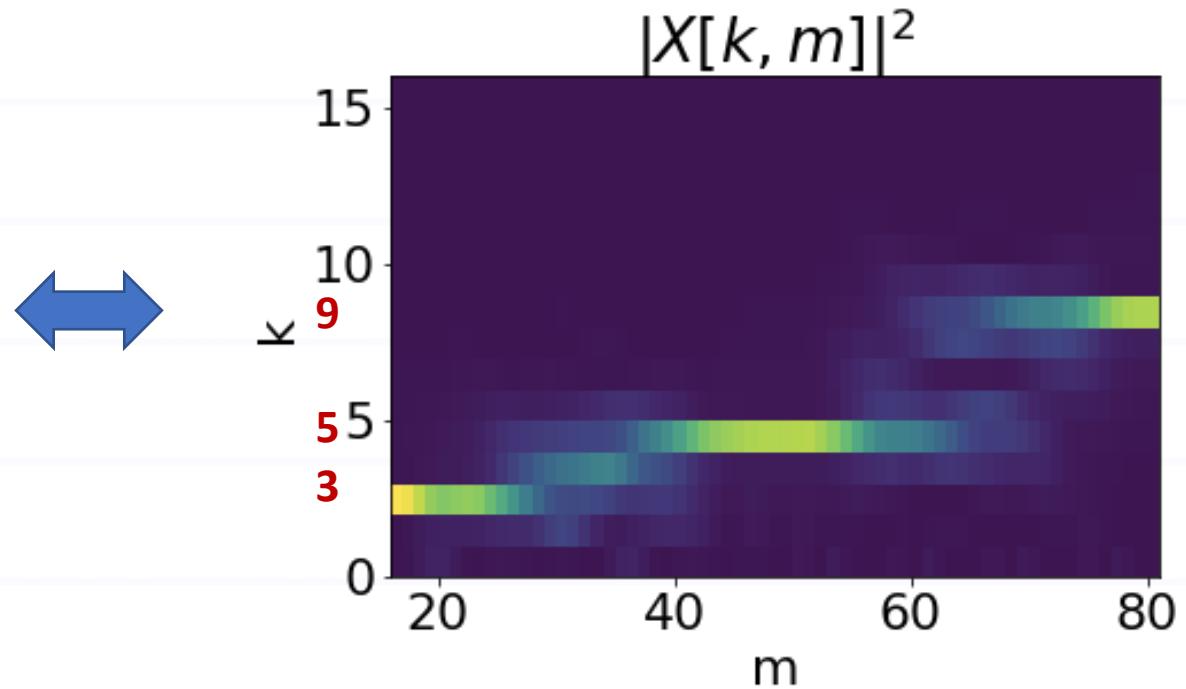
- Intuitively,



Short-time Fourier Transform (STFT)



$$x[n] = \sin(2\pi * f * n)$$



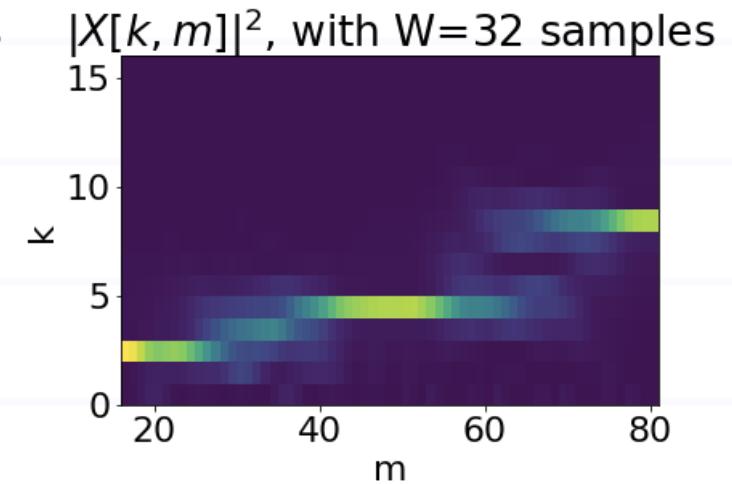
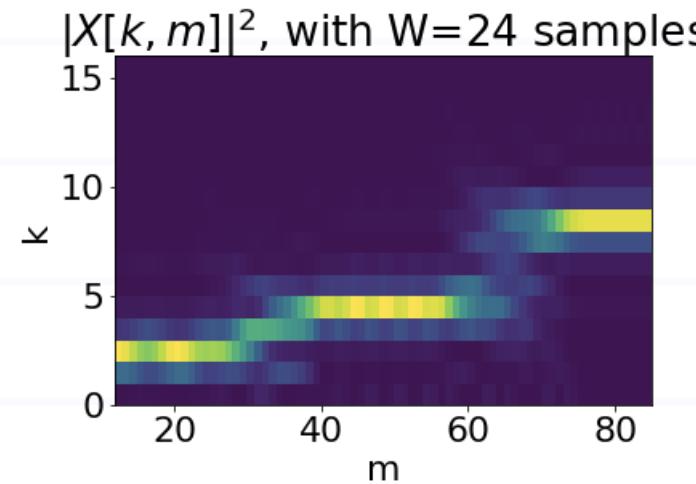
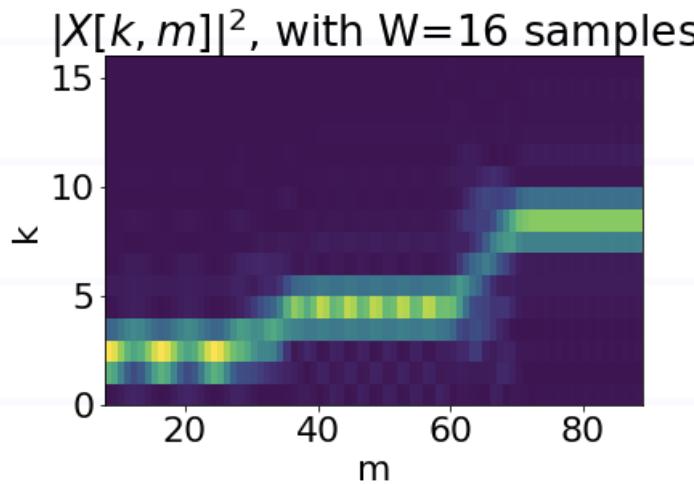
A Quasi-stationary Signal

$$\begin{aligned} W &= 32 \\ H &= 1 \end{aligned}$$

STFT preserves the signal characteristics, both in time and frequency

Short-time Fourier Transform (STFT)

- The effect of changing window size, W

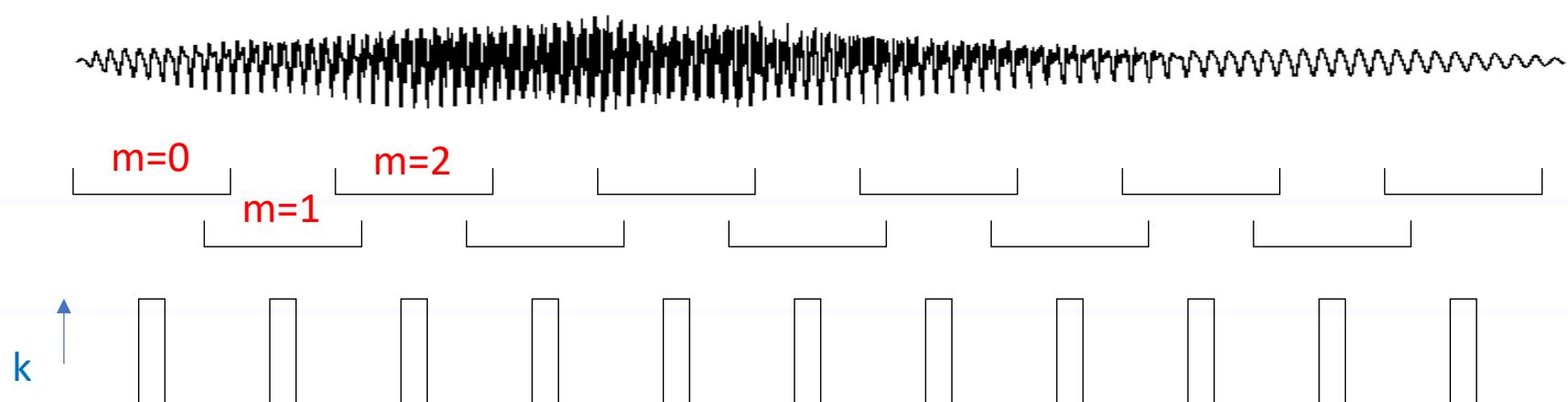


- Notice the trade off between **time resolution vs frequency resolution**
- Heisenberg uncertainty principal

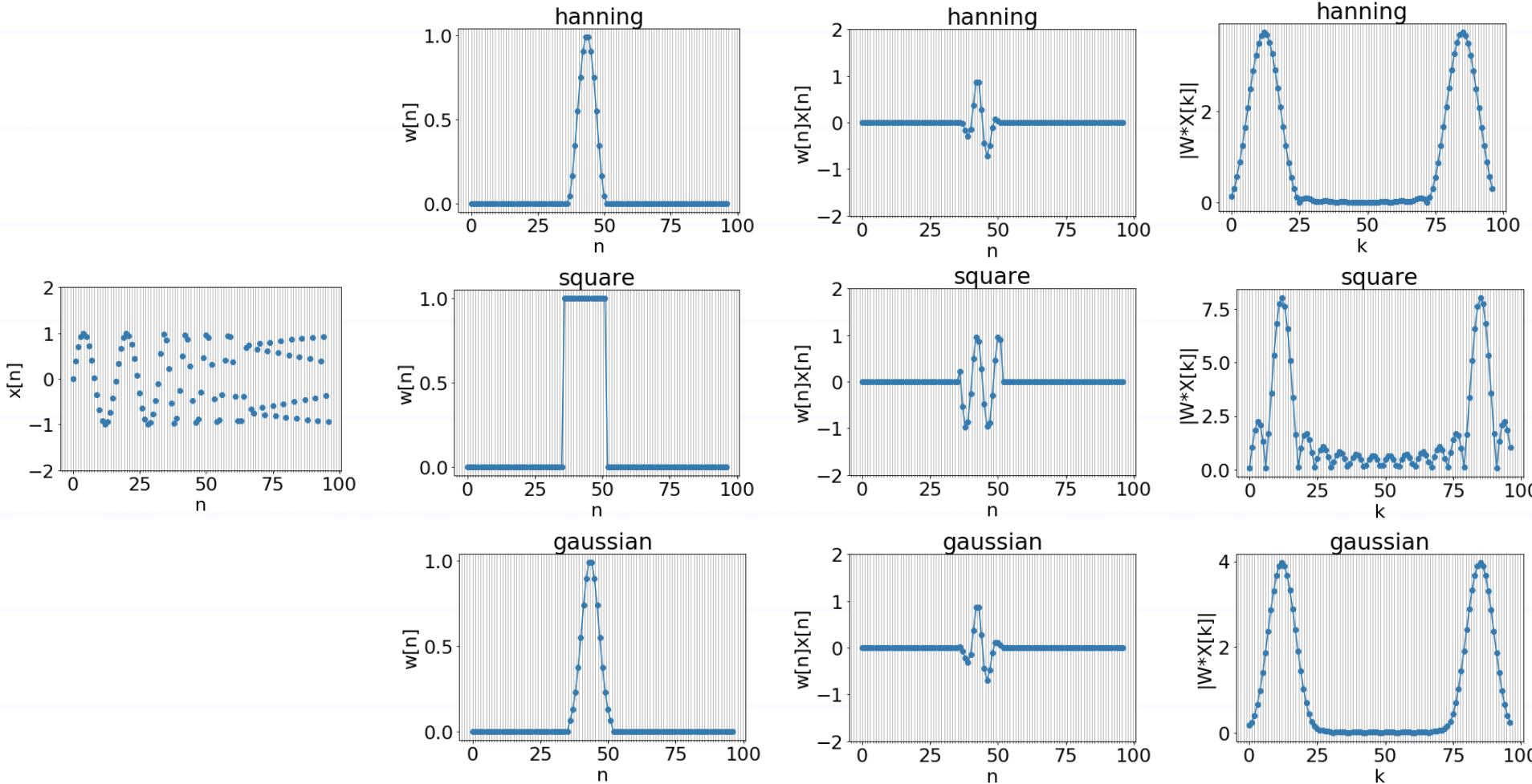
Short-time Fourier Transform (STFT)

- Mathematically,

$$X[k, m] = \sum_{n=0}^{N-1} x[n]w[n - mH]e^{-j\frac{2\pi}{N}kn}; \quad k = 0, 1, \dots, N-1$$

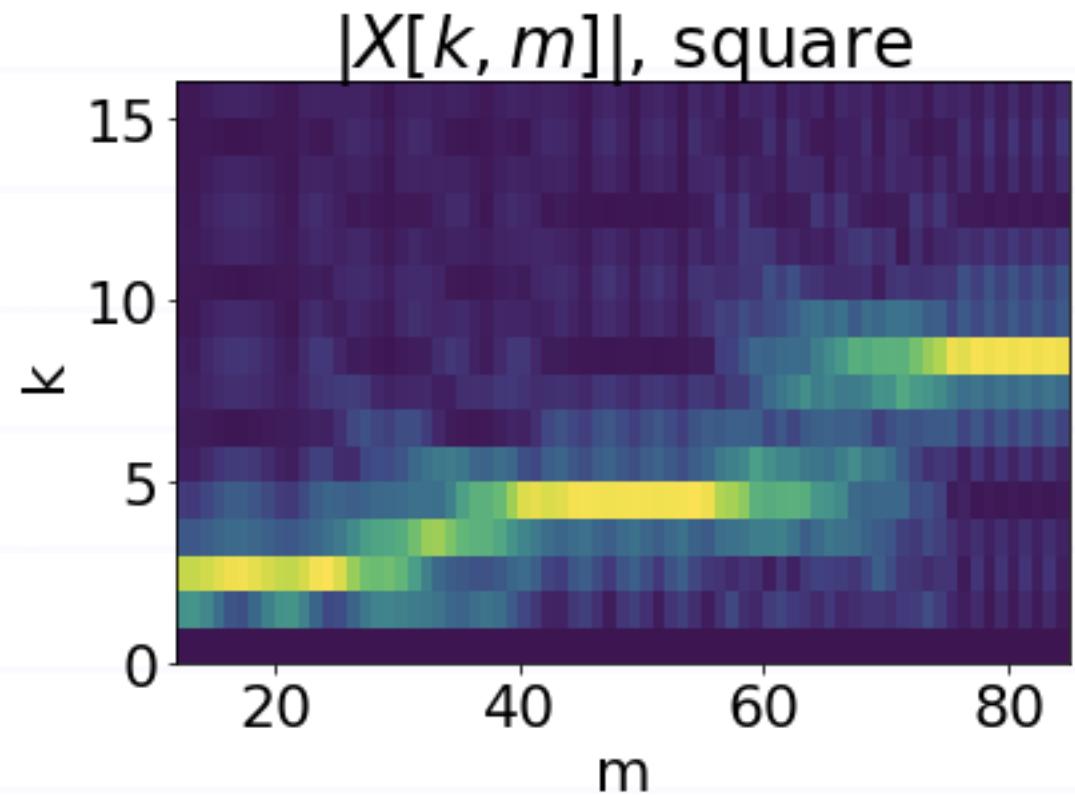
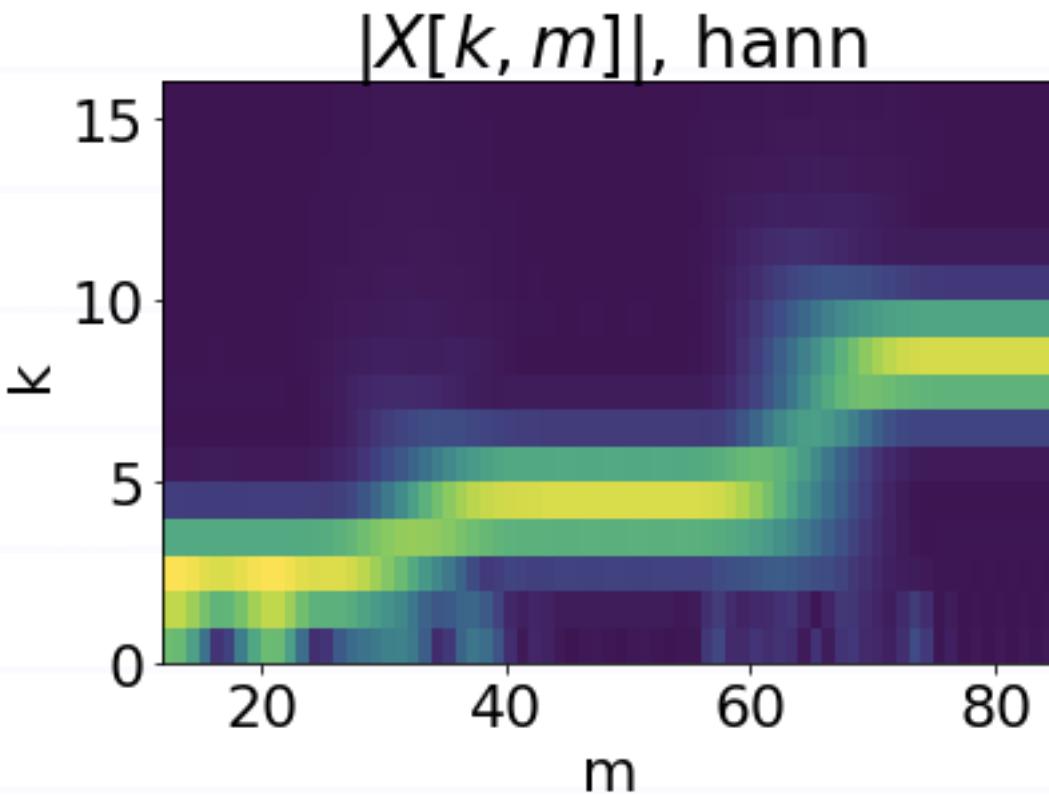


Window



Sharp
discontinuities
in signal cause
more side
lobes in $|X[k]|$

Spectrogram with windowing



Fast Fourier Transform

- FFT, $O(N \log N)$, is a faster implementation of DFT,
 $O(N^2)$
- Using FFTs in your computations results in computational gains

Topics studied

- Short-time Fourier Transform: signals changing over time

References

- https://www.tutorialspoint.com/digital_signal_processing/index.htm
- Quatieri, T. F. (2006). *Discrete-time speech signal processing: principles and practice*. Pearson Education India (Chapter 2)
- Oppenheim, A.V., Willsky, A.S., & Nawab, H.S. (1996). Signals and systems. *Pearson press, USA*.

Programming

- Programming languages
 - Python (mostly)
 - Bash scripts
- Python Jupyter, either of these:
 - Install on your machine
 - anaconda, jupyter, ...
 - Microsoft Azure Notebooks - <https://notebooks.azure.com/>
 - Google Colab - <https://colab.research.google.com/>

Python Tutorials

- Python Basics 1
 - https://www.youtube.com/watch?v=qZ_RJSJk534
- Python Basics 2
 - <https://www.youtube.com/watch?v=KZO9W3MPf68>
- Python Basics 3
 - <https://www.youtube.com/watch?v=kxQ-HOENUIQ>

