



## **NPTEL ONLINE CERTIFICATION COURSES**

**Course Name: Deep Learning**

**Faculty Name: Prof. Prabir Kumar Biswas**

**Department : E & ECE, IIT Kharagpur**

**Topic**

**Lecture 01: Introduction**

## CONCEPTS COVERED

### Concepts Covered:

- ☐ Deep Learning: An Introduction
- ☐ Descriptors/ Feature Vectors
- ☐ Machine Learning vs. Deep Learning
- ☐ Discriminative/ Generative Model
- ☐ Challenges
- ☐ Power of Deep Learning



# What is learning?



Image Source: Internet

# Can You Recognize these Pictures ?



- If Yes, How do you Recognize it?



Image Source: Internet

# Origin of Machine Learning?

.....Lies in very early efforts of understanding Intelligence.

- What is Intelligence?
- It can be defined as the ability to comprehend; to understand and profit from experience.
- Capability to acquire and Apply Knowledge.



Image Source: Internet



# Learning?

## 2300 Years ago....

- Plato (427-347 BC )
- The concept of Abstract Ideas are known to us a priori, through a Mystic connection with world.
- He concluded that ability to think is found in *a priori* knowledge of the concepts.

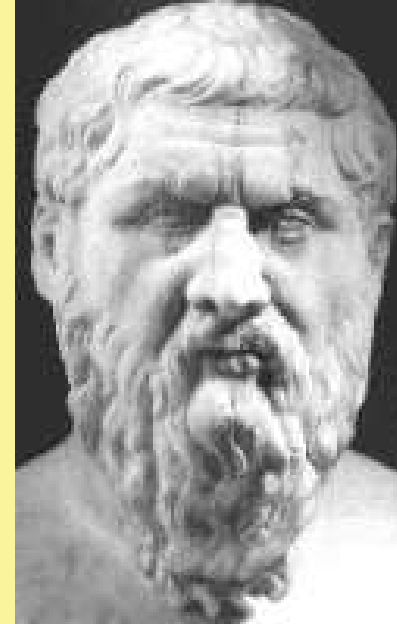


Image Source: Internet

# Learning?

## Plato's Pupil...

- Aristotle (384-322 BC)
- Criticized his Teacher's Theory  
as it is not taking into account  
the important aspect  
--- An ability to Learn or Adapt to changing  
world.

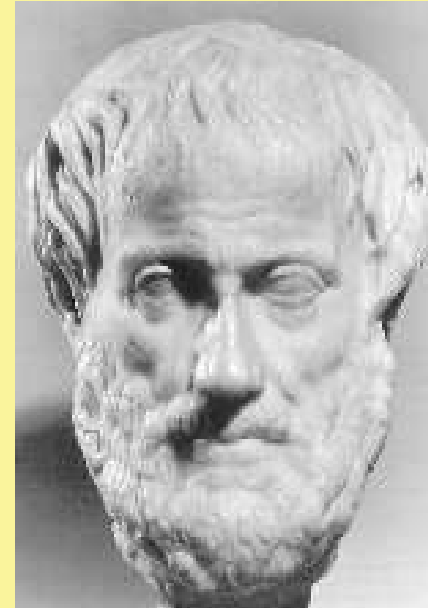


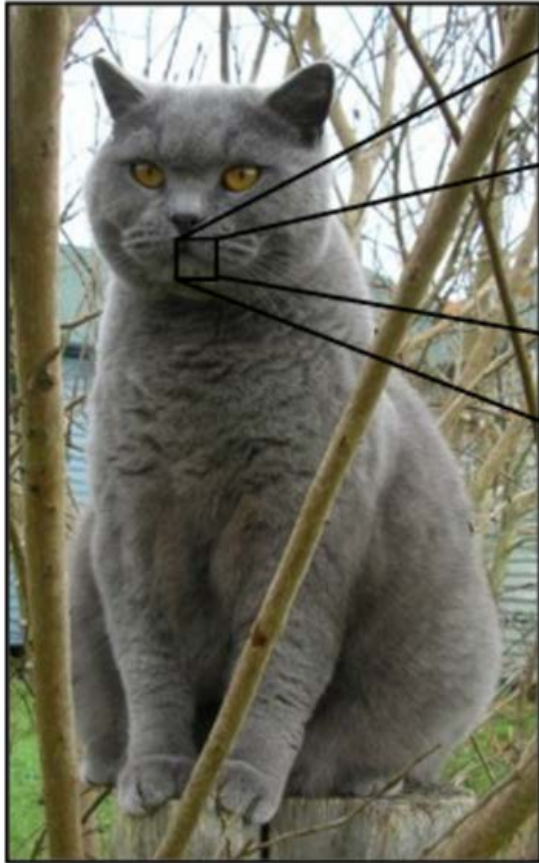
Image Source: Internet

# Descriptors/ Feature Vectors



Image Source: Internet





08	02	22	97	38	15	00	40	00	75	04	05	07	78	52	12	50	77	81	58
49	49	99	40	17	81	18	57	60	87	17	40	98	43	69	45	04	56	62	00
81	49	31	73	55	79	14	29	93	71	40	67	58	85	30	03	49	13	36	65
52	70	95	23	04	60	11	42	68	54	85	56	01	32	56	71	37	02	36	91
22	31	16	71	51	67	83	89	41	92	36	54	22	40	40	28	66	33	13	80
24	47	37	80	99	03	45	02	44	75	33	53	78	36	84	20	35	17	12	50
32	98	81	28	64	23	67	10	26	38	40	67	59	54	70	66	18	38	64	70
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24	55	58	05	66	73	99	26	97	17	78	78	96	83	14	88	34	89	63	72
21	36	23	09	75	00	76	44	20	45	35	14	00	61	33	97	34	31	33	95
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16	39	05	42	96	35	31	47	55	58	88	24	00	17	54	24	36	29	85	57
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20	69	36	41	72	30	23	88	34	49	99	69	82	67	59	85	74	04	36	16
20	73	35	29	78	31	90	01	74	31	49	71	48	86	41	16	23	57	05	54
01	70	54	71	83	51	54	69	16	92	33	48	61	43	52	01	89	13	72	48

What the computer sees

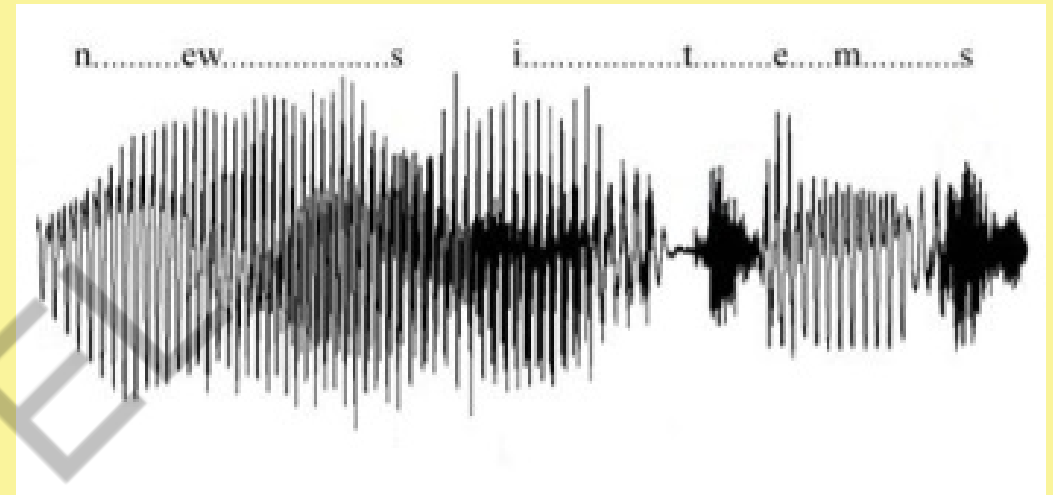


Image Source: Internet

# Descriptors/ Feature Vectors



Image Source: Internet

# Descriptors/ Feature Vectors

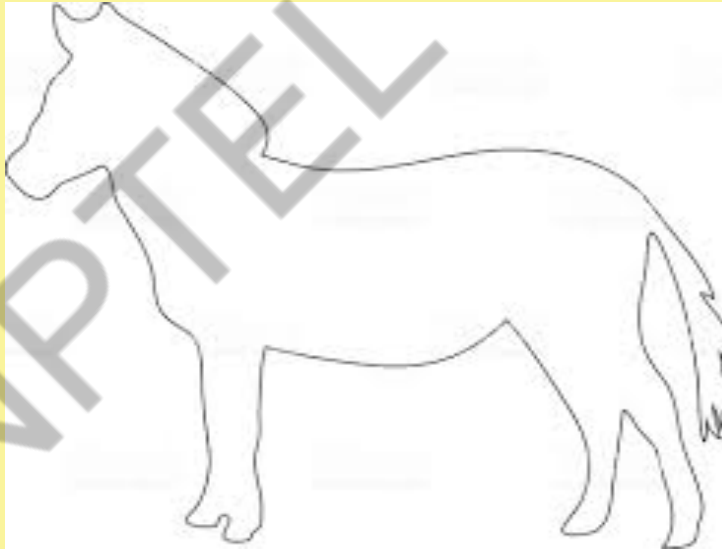
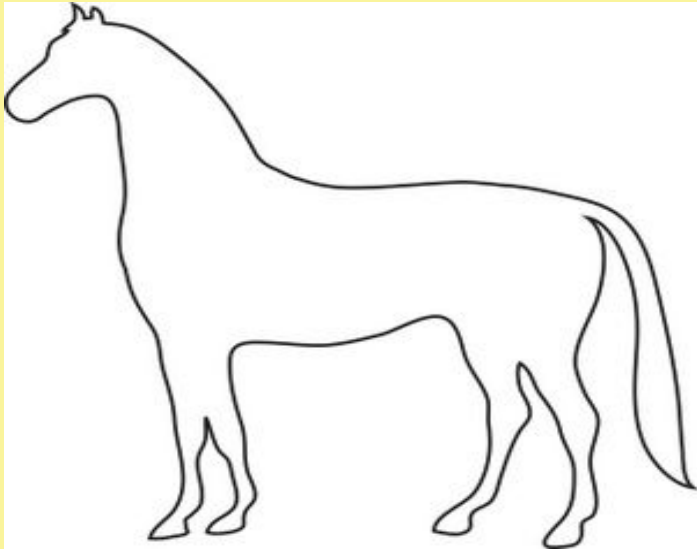


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# Descriptors/ Feature Vectors



Image Source: Internet

# Machine Learning vs Deep Learning



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# Discriminative vs. Generative Model



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# Discriminative Model

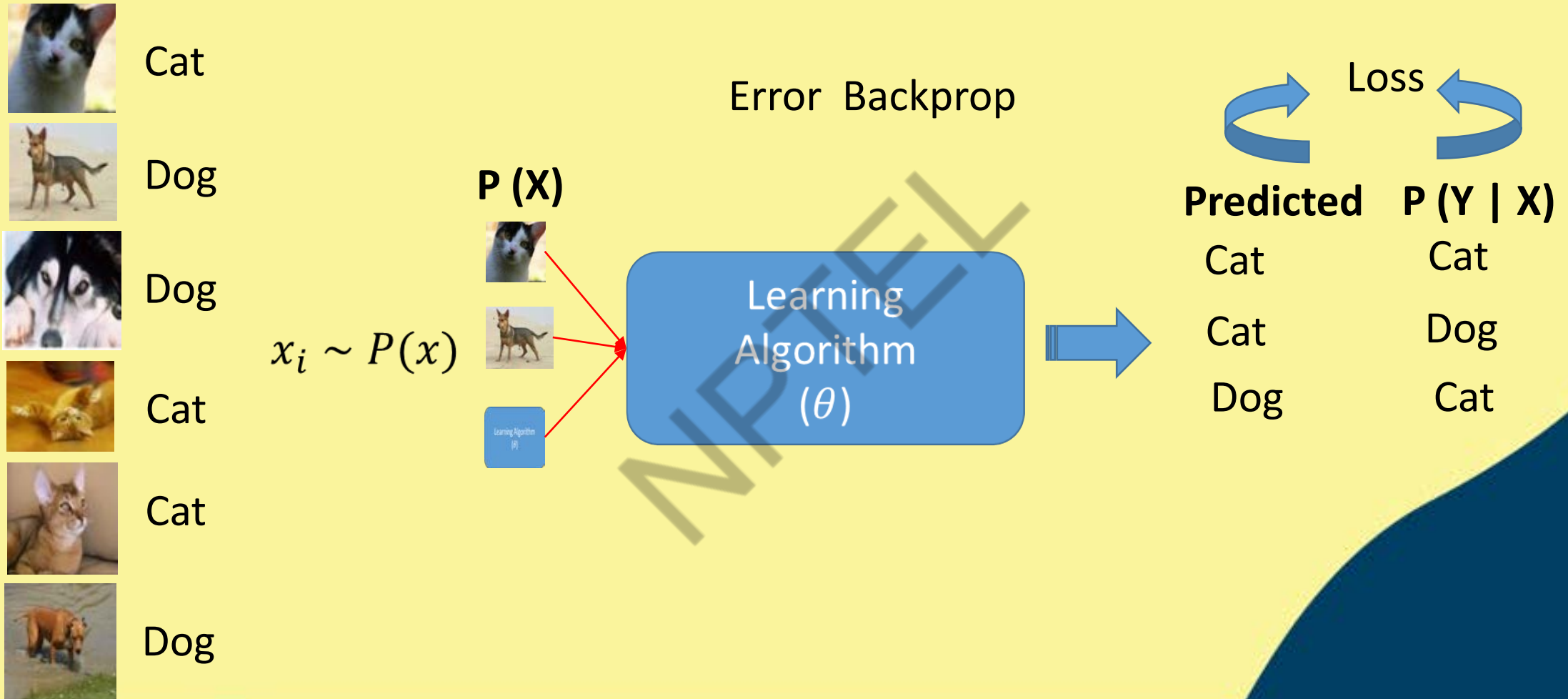


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# Generative Model

“What I can not create, I do not understand.”

- Richard Feynman

- ❑ Collect a large amount of data in some domain
- ❑ Train a model to generate data like it.



# Challenge s



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# Viewing Angle



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# Pose

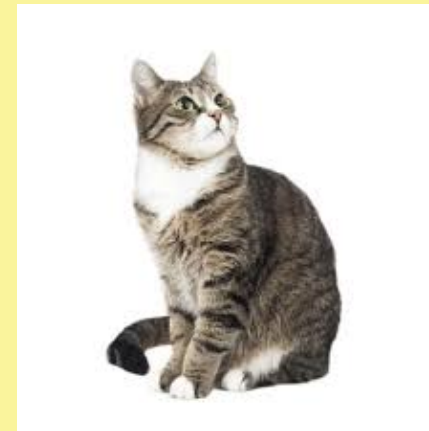


Image Source: Internet



# Illumination



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# Intraclass Variation



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# Distortion and Occlusion



Image Source: Internet

# Power of Deep Learning



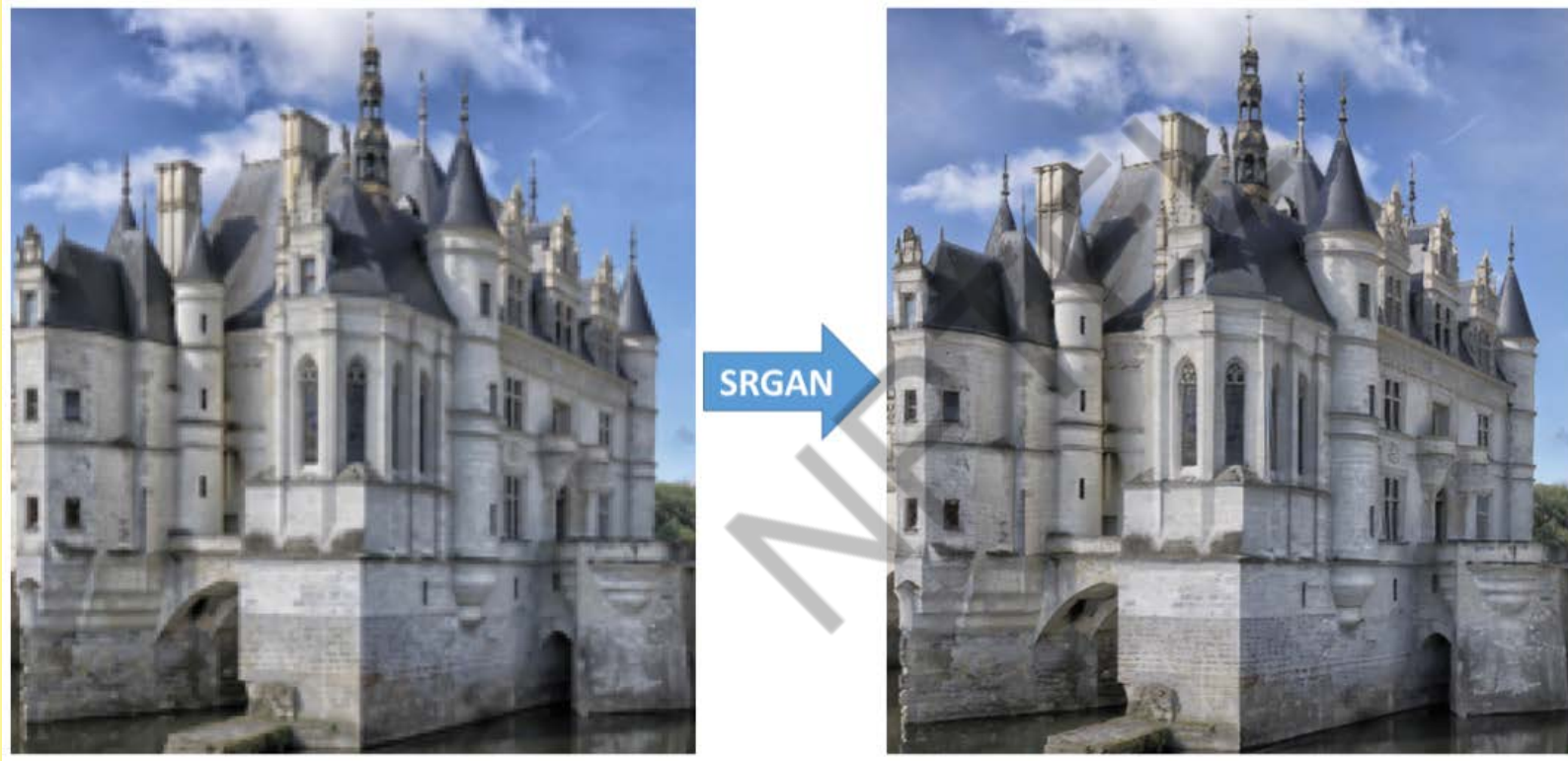
# High Resolution Image Synthesis\*



\* Karras, Tero, Timo Aila, Samuli Laine, and Jaakko Lehtinen.  
"Progressive growing of gans for improved quality, stability,  
and variation." ICLR, 2018.

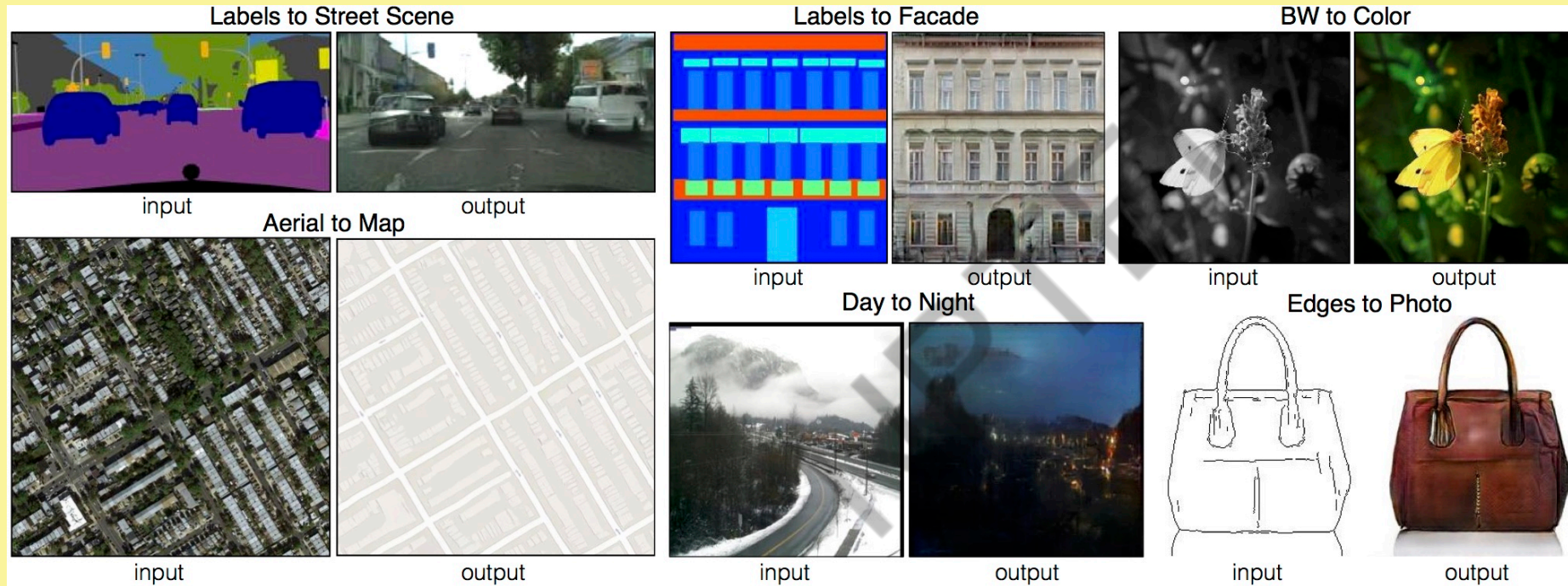


# Image Super resolution\*



\* Ledig et al.. "Photo-Realistic Single Image Super-Resolution Using a Generative Adversarial Network" CVPR 2016

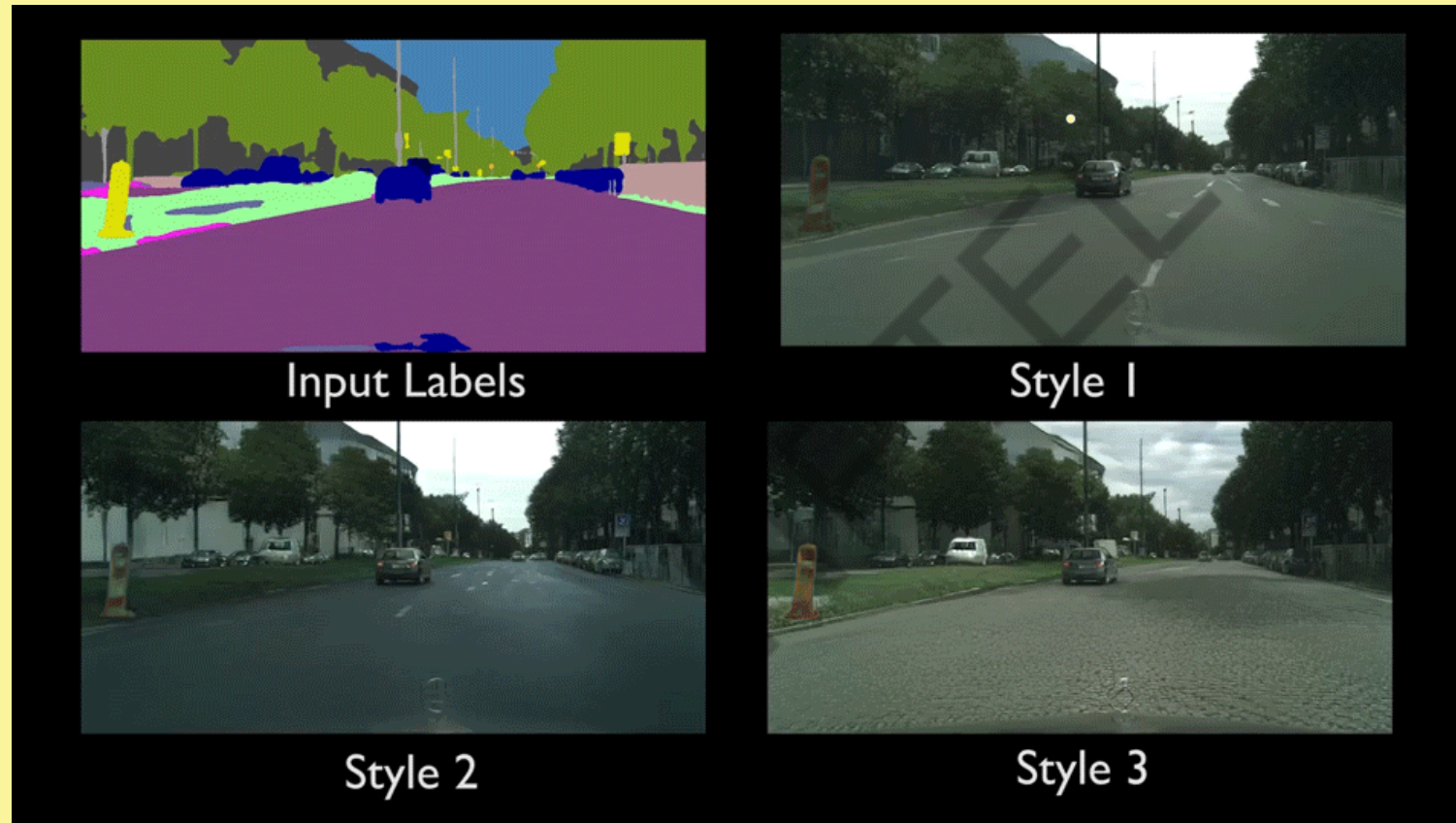
# Image to Image Translation\*



\* Isola, Phillip, Jun-Yan Zhu, Tinghui Zhou, and Alexei A. Efros.  
"Image-to-image translation with conditional adversarial  
networks." *CVPR*, 2017

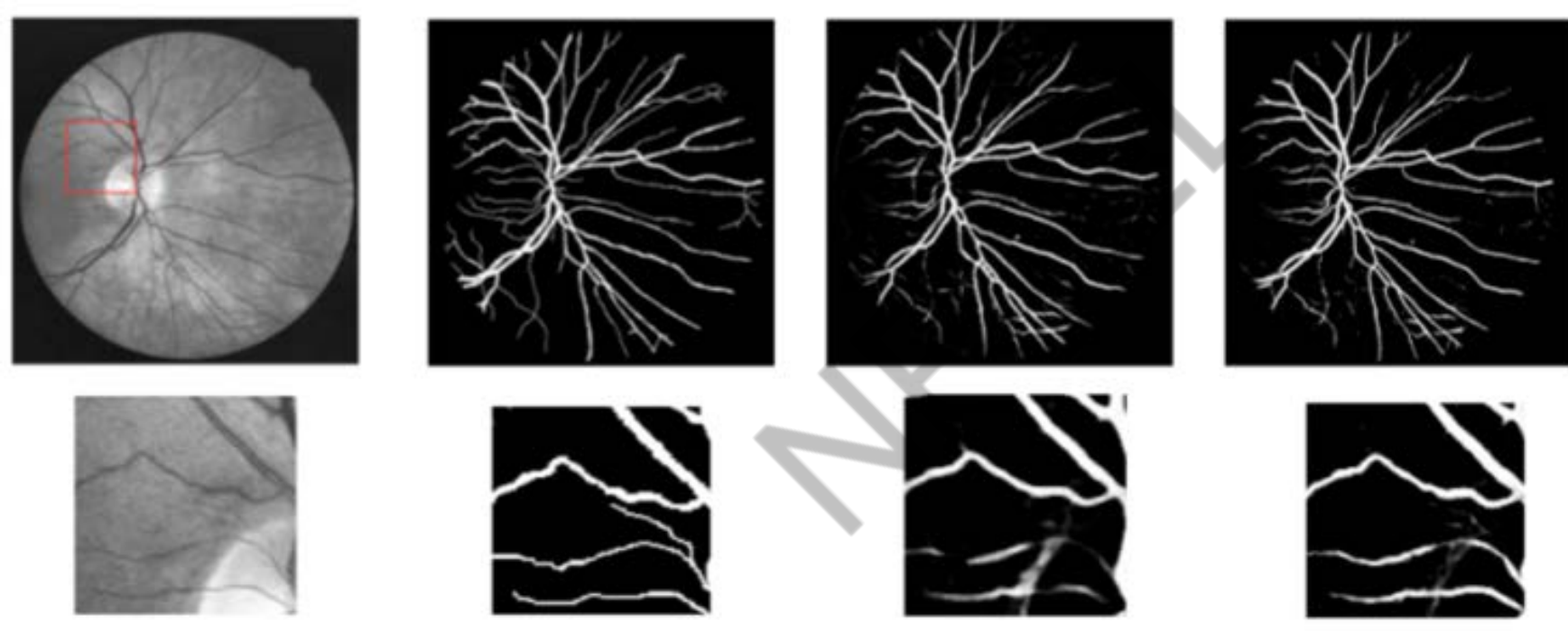


# Video to Video Translation\*



\*Wang, Ting-Chun, Ming-Yu Liu, Jun-Yan Zhu, Guilin Liu, Andrew Tao, Jan Kautz, and Bryan Catanzaro. "Video-to-video synthesis." *NeurIPS*, 2018

# Medical Image Processing





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**Course Name: Deep Learning**  
**Faculty Name: Prof. Prabir Kumar Biswas**  
**Department : E & ECE, IIT Kharagpur**

**Topic**  
**Lecture 02: Feature Vector**



# Descriptors/ Feature Vectors



Image Source: Internet

# Descriptors/ Feature Vectors

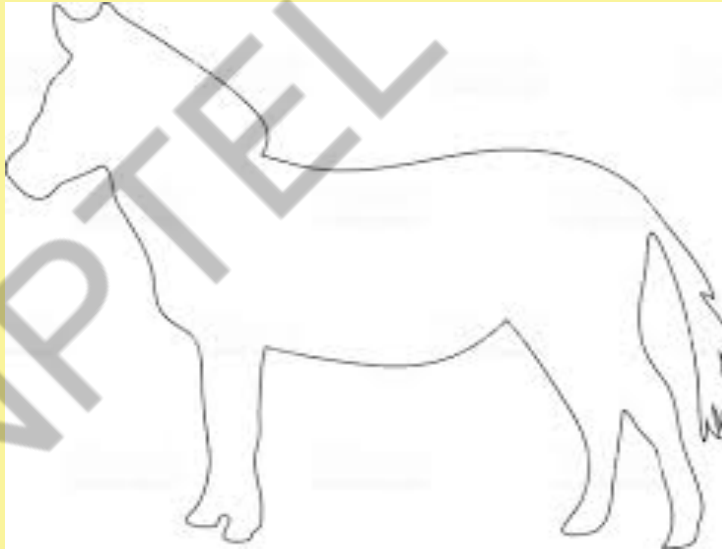
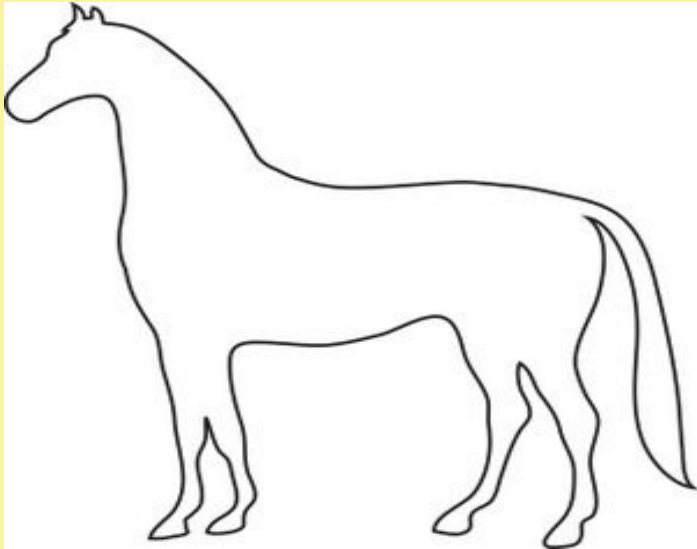


Image Source: Internet

# Descriptors/ Feature Vectors



Image Source: Internet

## CONCEPTS COVERED

### Concepts Covered: Descriptors/ Features

#### ☐ Visual Signals

- ❖ Boundary Features

- ❖ Region Features

#### ☐ Audio Signals





# Boundary Descriptors



# Shape Feature/ Polygonal Representation

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# Signature

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# Fourier Descriptor

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# Statistical Moments

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# Region Descriptors





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**Department : E & ECE, IIT Kharagpur**

**Topic**

**Lecture 03: Region Descriptors**



# Descriptors/ Feature Vectors



Image Source: Internet

# Descriptors/ Feature Vectors

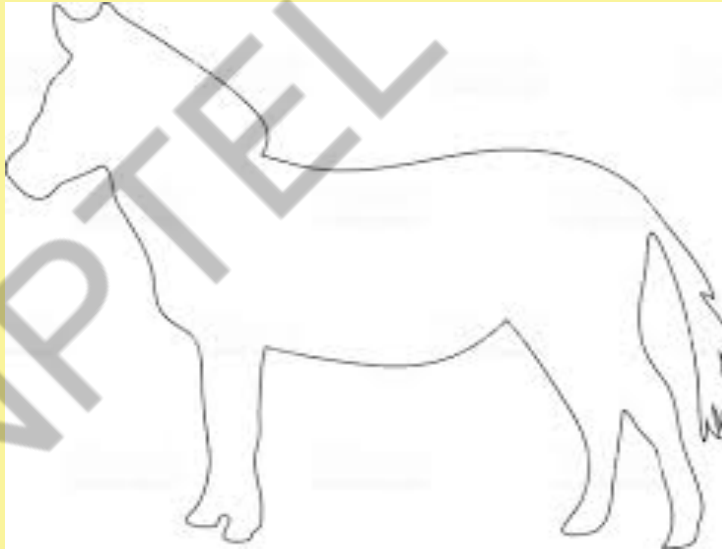
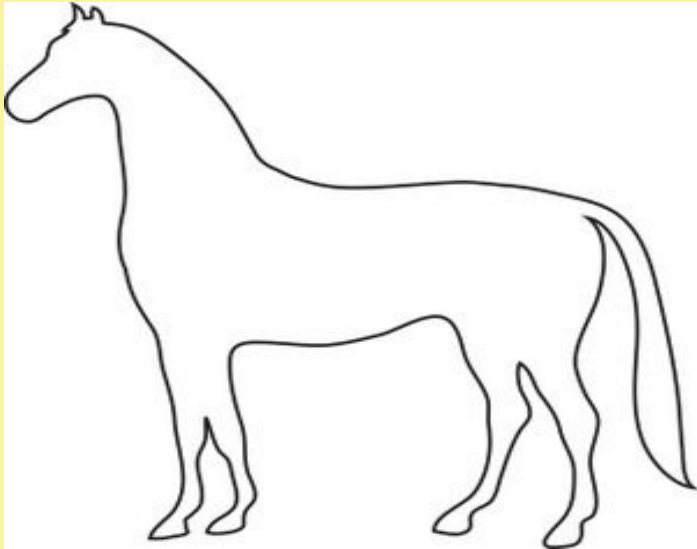


Image Source: Internet

# Descriptors/ Feature Vectors



Image Source: Internet

## CONCEPTS COVERED

Concepts Covered: Descriptors/ Features

❑ Visual Signals

❖ Boundary Features

❖ Region Features

❑ Audio Signals





# Region Descriptors

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# Intensity Descriptor

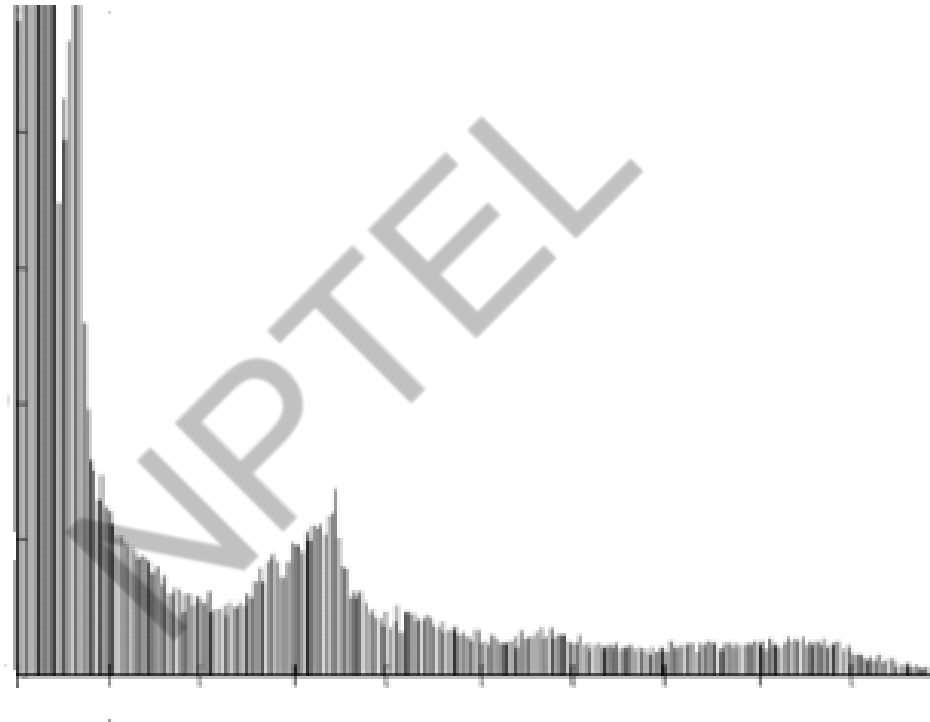
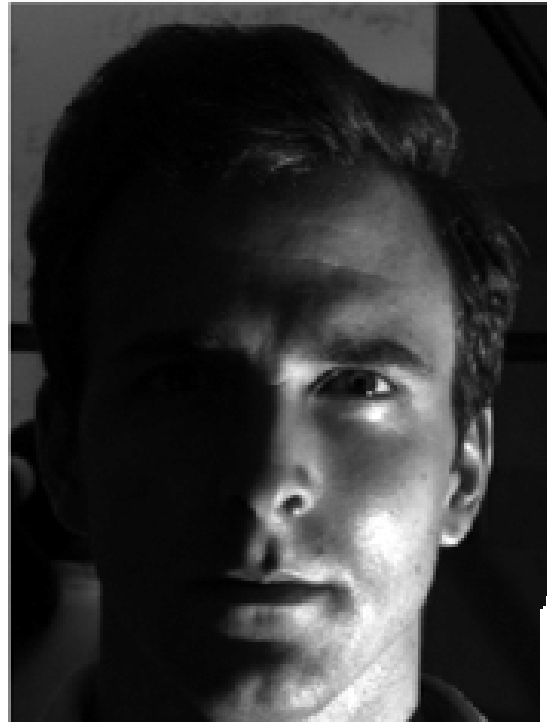


Image Source: Internet

# Intensity Descriptor

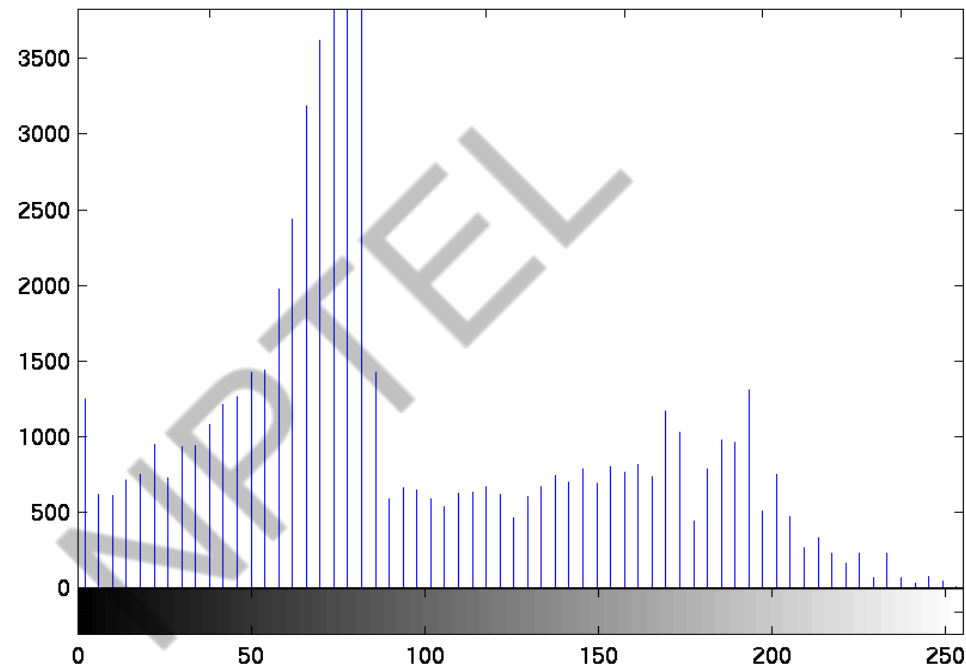


Image Source: Internet

# Colour Feature

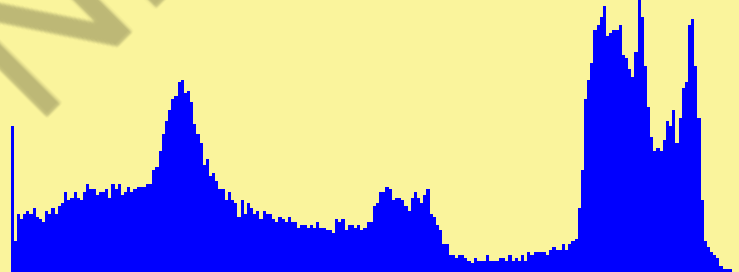
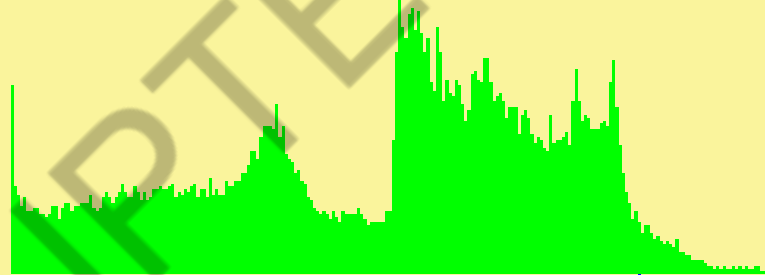


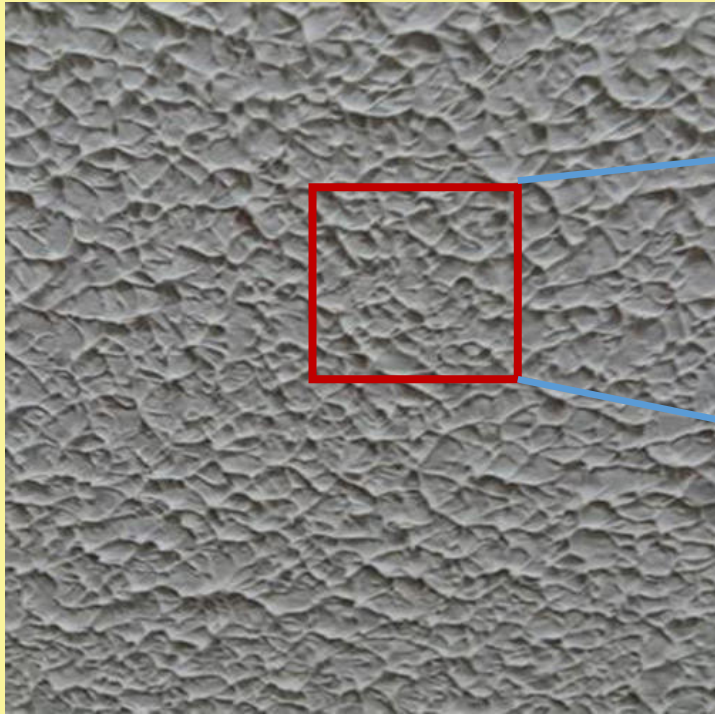
Image Source: [https://billmill.org/the\\_histogram.html](https://billmill.org/the_histogram.html)



# Texture Descriptors



# Pixel Domain/ Co-occurrence Matrix



150	100	115	109	112	100	145	140
110	112	120	135	125	120	132	133
152	99	129	130	122	135	98	100
147	138	142	95	108	136	110	125
99	127	149	138	138	129	108	129
128	125	139	115	120	145	137	131
146	159	150	130	147	139	143	127
140	120	128	98	100	106	115	119

# Pixel Domain/ Co-occurrence Matrix

10	9	7	9	5	8	11	9
6	5	15	12	4	6	3	2
9	3	2	10	6	8	4	5
8	2	4	3	7	5	6	1
2	0	11	8	10	9	8	2
8	4	7	1	6	0	7	6
2	3	8	9	11	6	3	9
7	2	8	8	6	12	6	7



# Co-occurrence matrix based descriptors

Maximum Probability

$$\max_{i,j}(c_{ij})$$

Element Difference Moment

$$\sum_i \sum_j (i-j)^k C_{i,j}$$

Inverse Element Difference Moment

$$\sum_i \sum_j C_{i,j} / (i-j)^k \quad i \neq j$$

Uniformity

$$\sum_i \sum_j C_{ij}^2$$

Entropy

$$-\sum_i \sum_j c_{ij} \log_2 C_{ij}$$

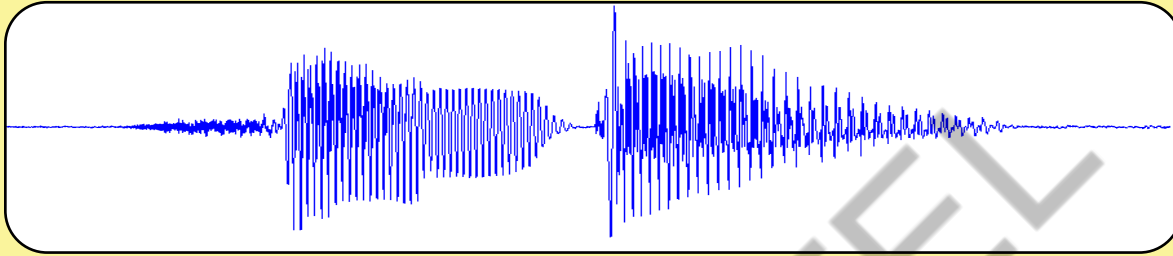




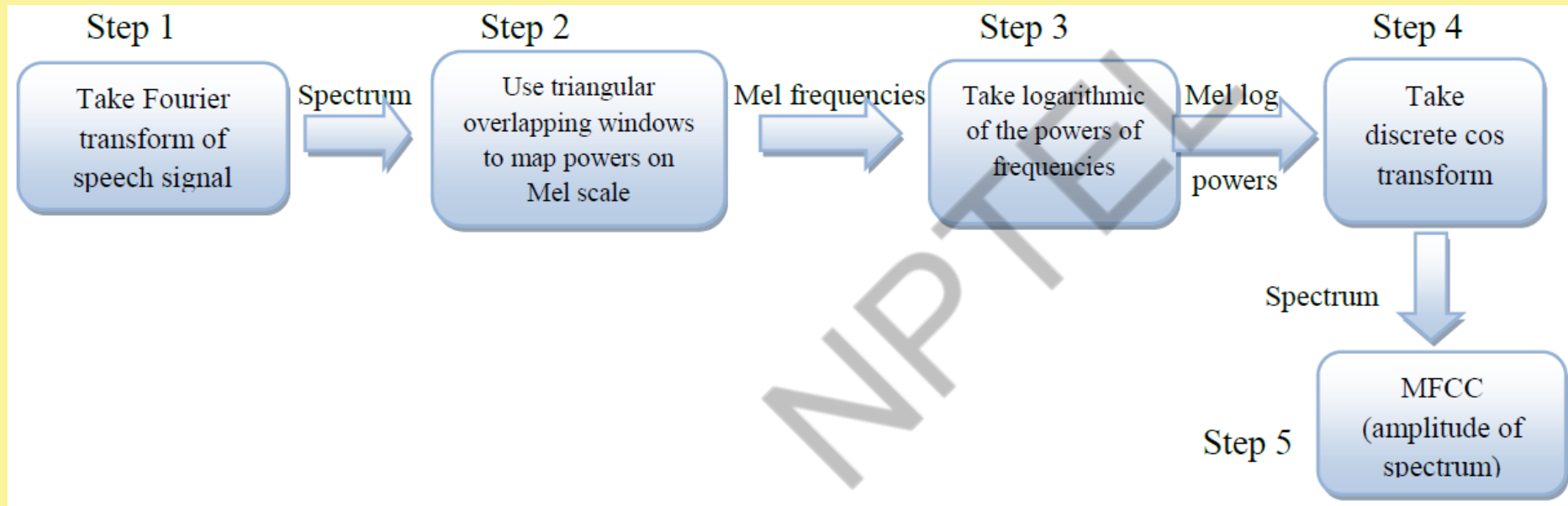
# Audio



# Time Domain Feature - LPC



# Spectral Domain- MFCC



# Traditional Machine Learning vs. Deep Learning

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## **NPTEL ONLINE CERTIFICATION COURSES**

**Course Name: Deep Learning**

**Faculty Name: Prof. P. K. Biswas**

**Department : Electronics and Electrical Communication Engineering**

**Topic**

**Lecture 04: Bayesian Learning**

## CONCEPTS COVERED

### Concepts Covered:

- ☐ Feature Space Representation
- ☐ Bayes Rule
- ☐ Bayes Minimum Error Classifier
- ☐ Bayes Minimum Risk Classifier



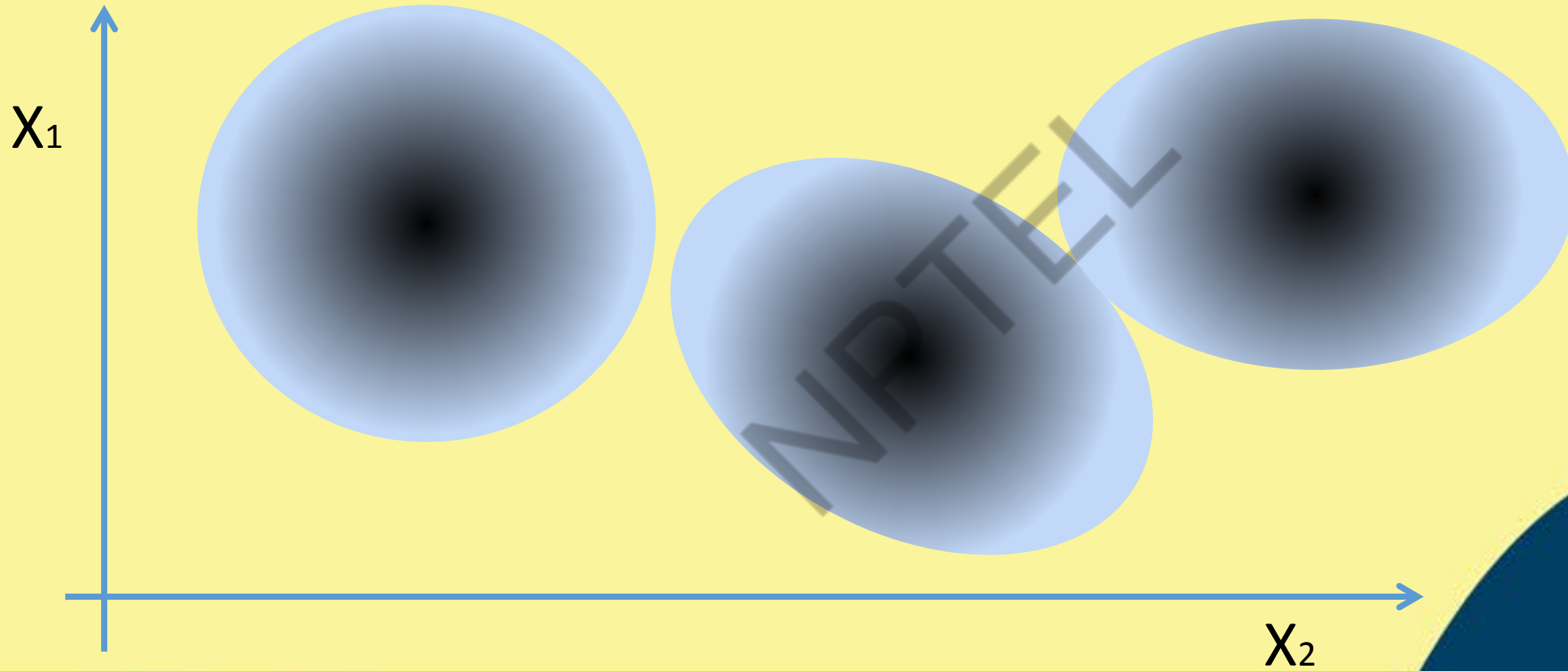
# Feature Space Representation



Image Source: Internet



# Feature Space Representation





# Feature Space Representation

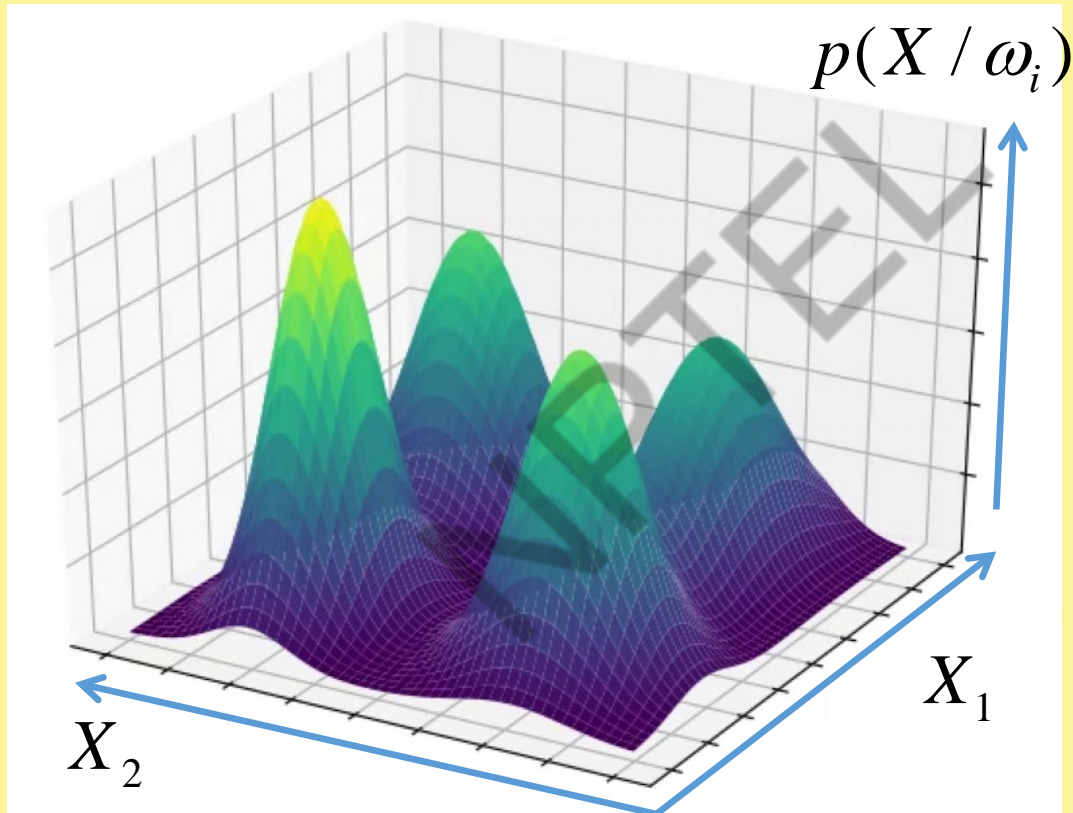


Image Source: Internet

# Bayesian Learning

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**Course Name: Deep Learning**

**Faculty Name: Prof. P. K. Biswas**

**Department : Electronics and Electrical Communication Engineering**

**Topic**

**Lecture 05: Bayes Minimum Risk Classifier**

## CONCEPTS COVERED

### Concepts Covered:

- ☐ Feature Space Representation
- ☐ Bayes Rule
- ☐ Bayes Minimum Error Classifier
- ☒ Bayes Minimum Risk Classifier





# Feature Space Representation



Image Source: Internet

# Feature Distribution

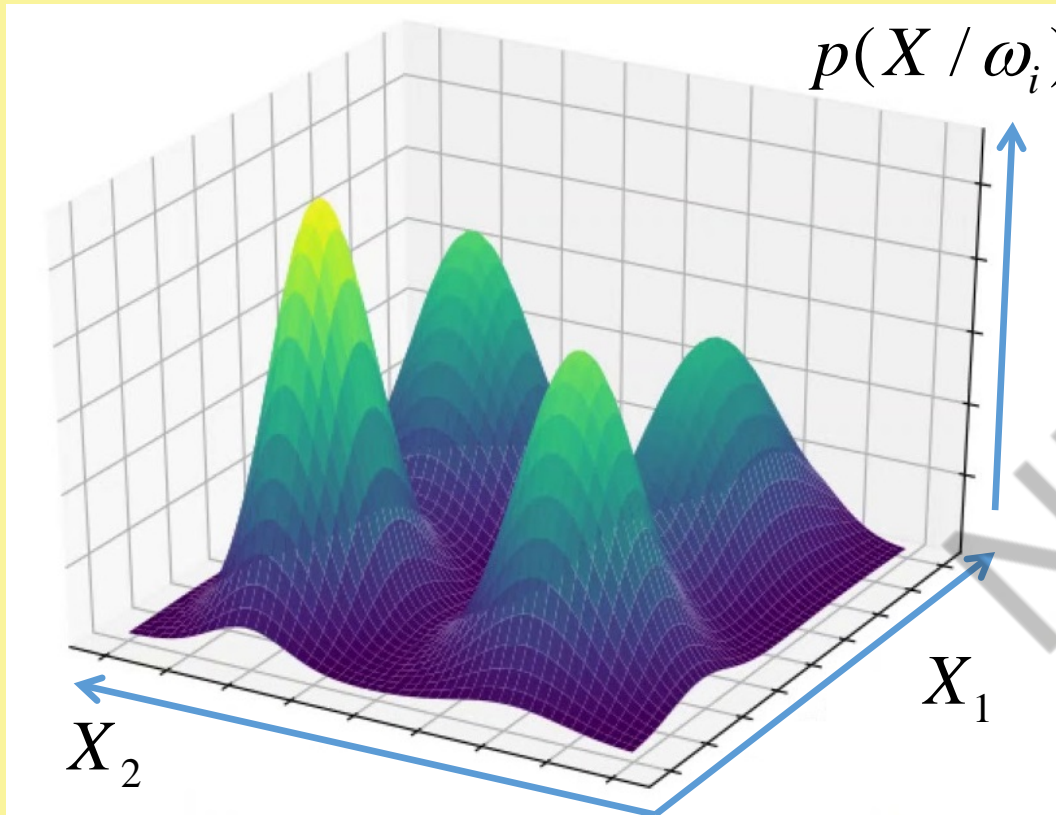


Image Source: Internet

# Bayes Minimum Error Classification

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# Bayes Minimum Risk Classification

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