

# Identifying and Visualizing Probabilistic and Statistical Relationships

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# Overview

**Seaborn for statistical visualizations**

**Understanding kernel density estimation and KDE plots**

**Univariate analysis using histograms, KDE plots and rug plots**

**Visualizing pairwise relationships in data**

**Visualizing multivariate relationships using the facet grid**

# Visualizing Data with Seaborn

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# Seaborn

Built on top of matplotlib and tightly integrated with the PyData stack, including support for numpy and pandas data structures and statistical routines from scipy and statsmodels.

[seaborn.pydata.org](http://seaborn.pydata.org)

# Seaborn For “Production Plots”

## Matplotlib

Part of “Pydata” - open data science stack

Provides fine-grained control so that pretty much everything is possible

## Seaborn

Built atop Matplotlib and tightly integrates with Pydata

High level, easy-to-use abstractions for common use cases

# Matplotlib and Seaborn

Seaborn  
(Package)

Matplotlib  
(Package)

matplotlib.  
pyplot  
(Module)

Pylab  
(Module)

Object level APIs  
("Matplotlib APIs")

Pandas  
(Package)

Numpy  
(Package)

PyData  
(stack)

...

# Matplotlib and Seaborn

**Seaborn  
(Package)**

High-level  
APIs

Matplotlib  
(Package)

matplotlib.  
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Pylab  
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Object level APIs  
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# Matplotlib and Seaborn

Seaborn  
(Package)

Built on top  
of Matplotlib

**Matplotlib  
(Package)**

matplotlib.  
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...

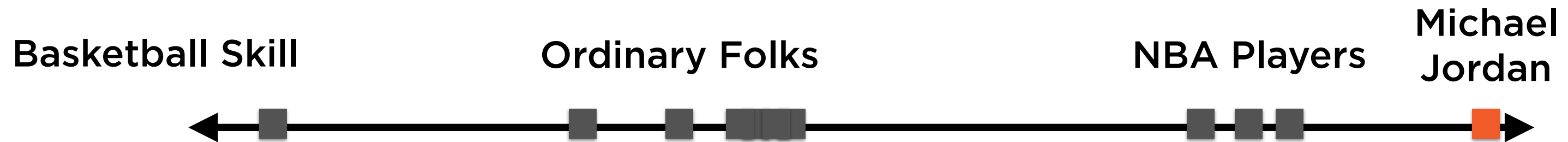


# Understanding KDE Plots

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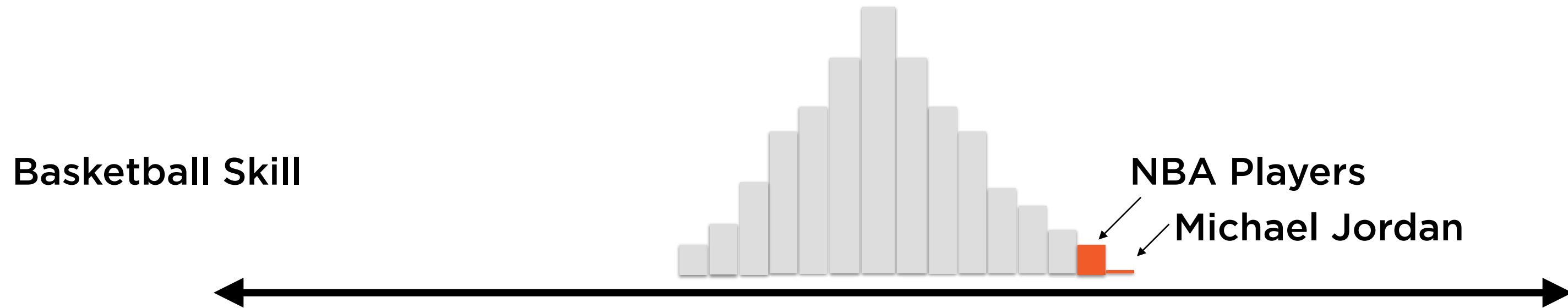
“Michael Jordan is a once-in-a-lifetime player”

# Outliers



A once-in-a-lifetime player is an outlier, a point far from the pack

# Outliers

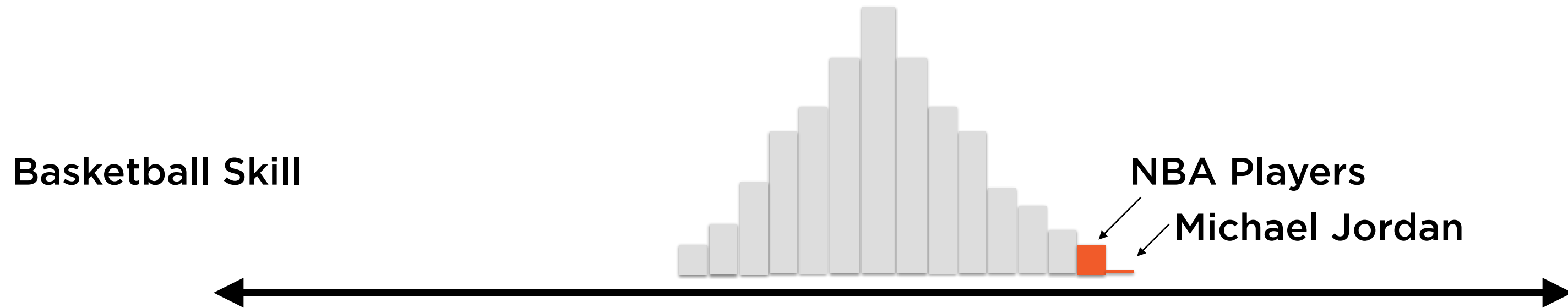


In reality, most ordinary folks would be clustered  
around an average level of skill

The NBA players would be outliers

Michael Jordan would be an even greater outlier

# Outliers

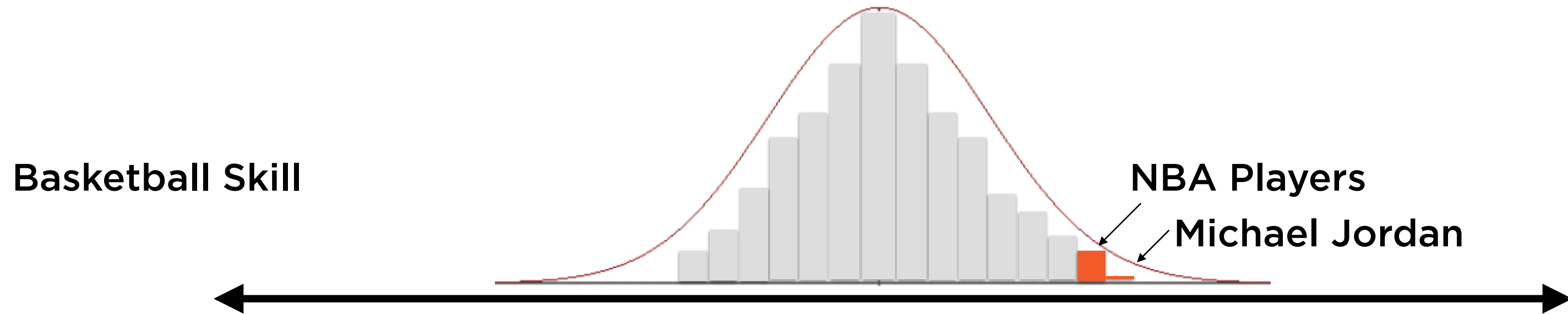


This chart above tells us how common a specific level of skill is

The shape of this chart resembles a bell

This is a Normal Probability Distribution

# Outliers

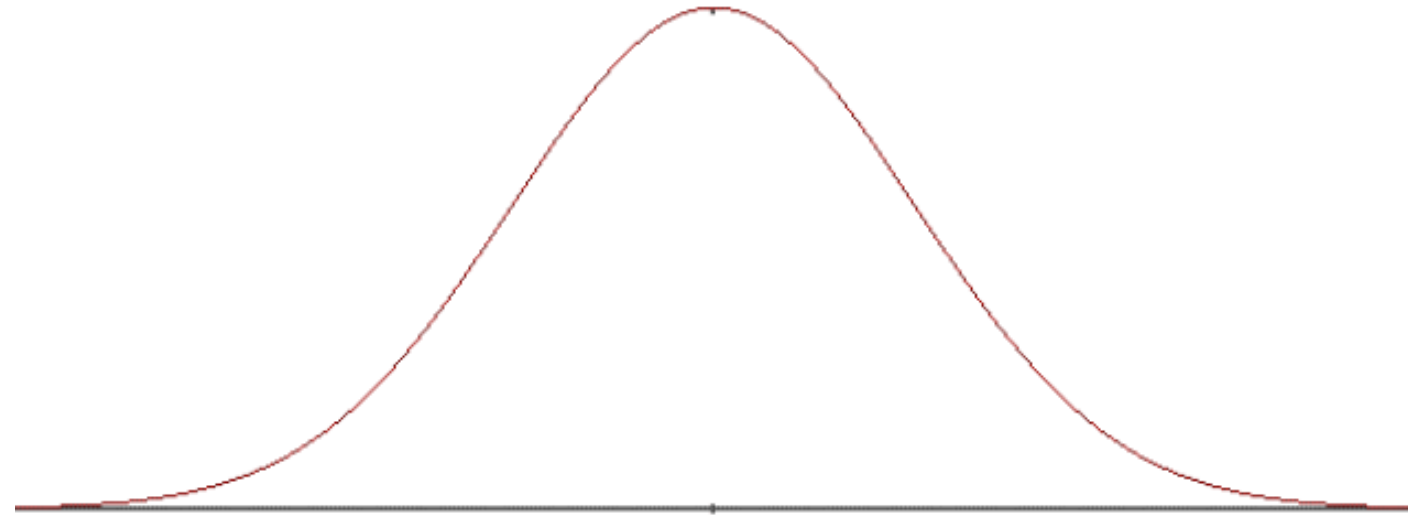


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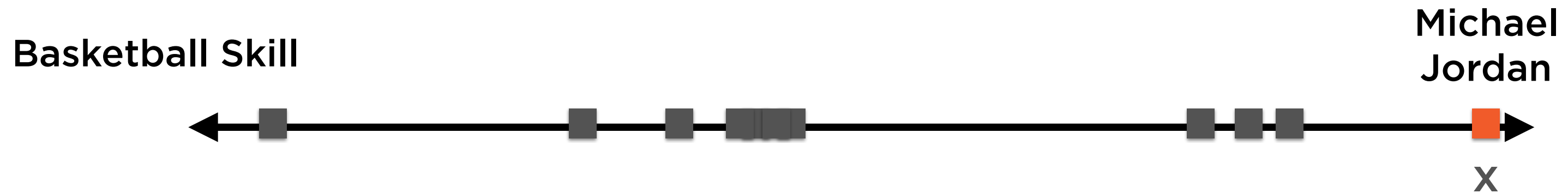


**Average is common**

**Very high and very low are both unusual**

**The bell curve occurs everywhere in nature**

# Outliers



What is the probability of any specific value  $x$  occurring in the data?

The answer lies in a **probability distribution function**



# Kernel Density Estimation

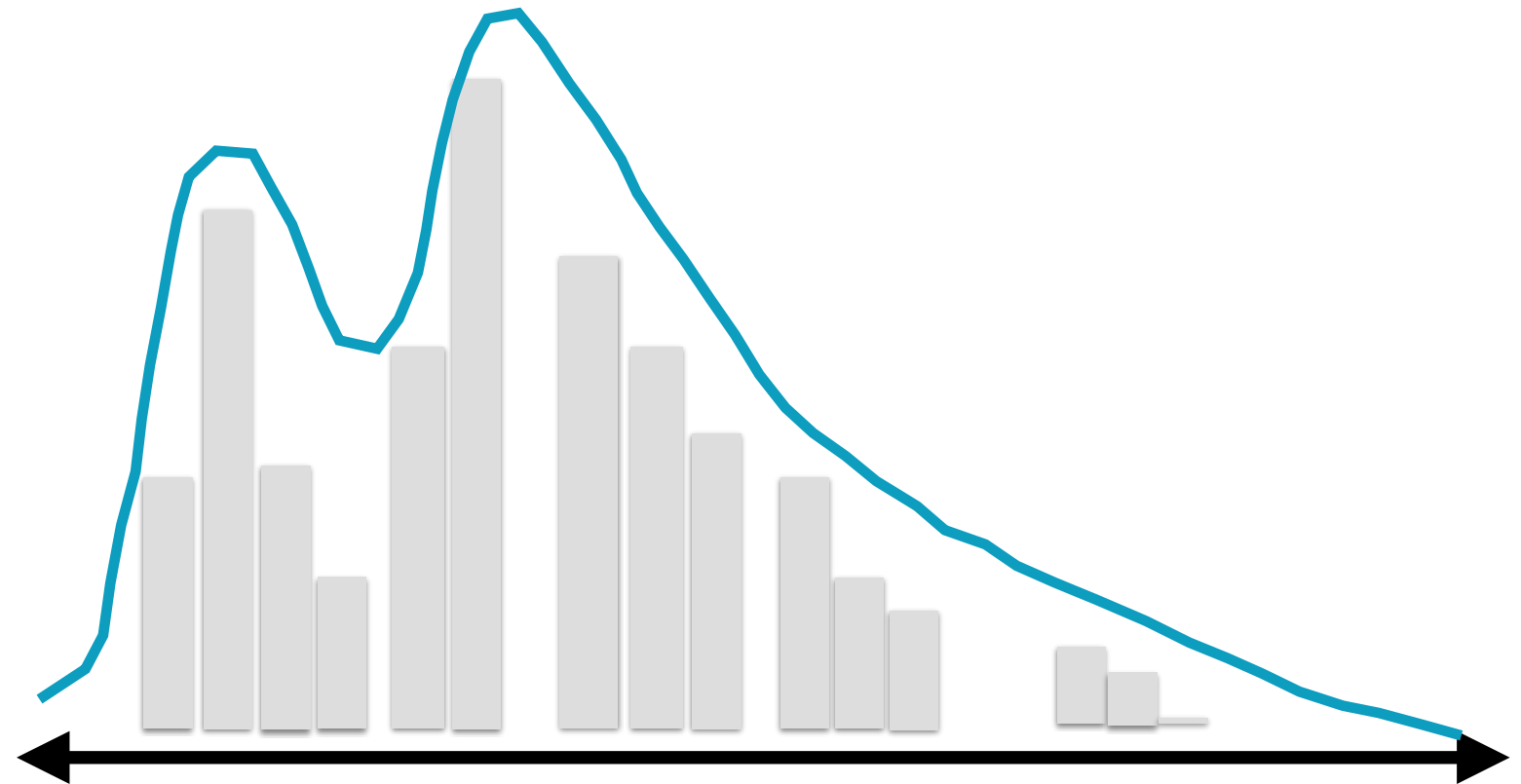
A mathematical technique used to get a smooth probability distribution from a histogram of raw data

# Kernel Density Estimation

**Given a set of  
points**

**Figure out their  
probability distribution**

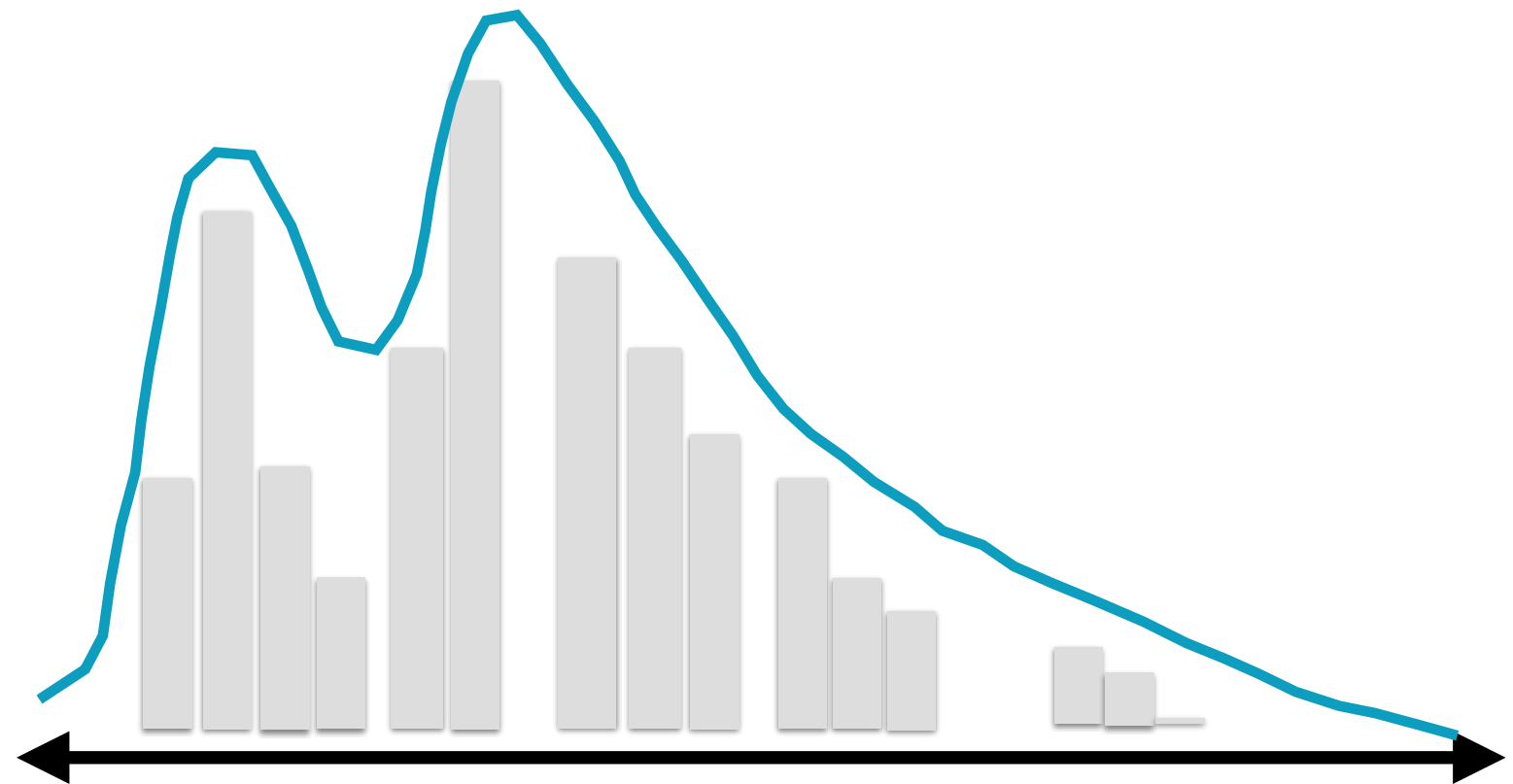
**Area under curve must  
sum to 1**



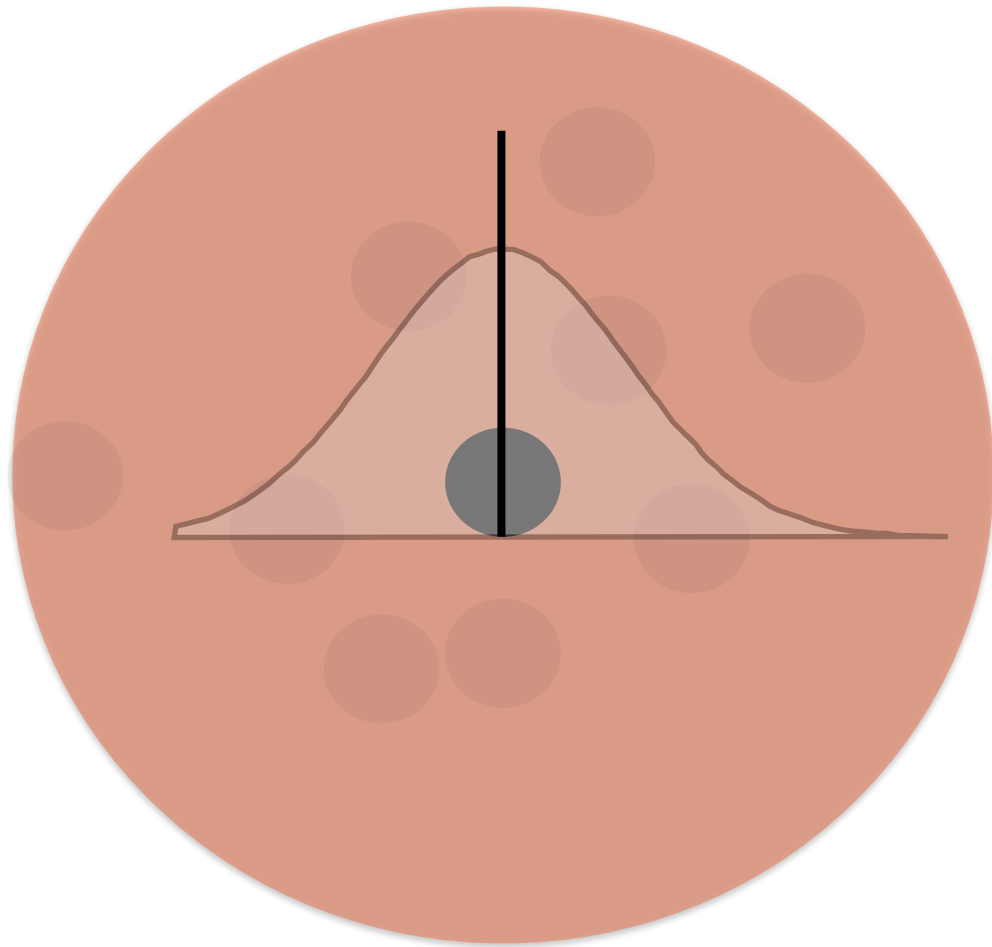
# Kernel Density Estimation

**KDE is a standard  
technique**

**Non-parametric  
“smoothing” technique**



# Gaussian Kernel



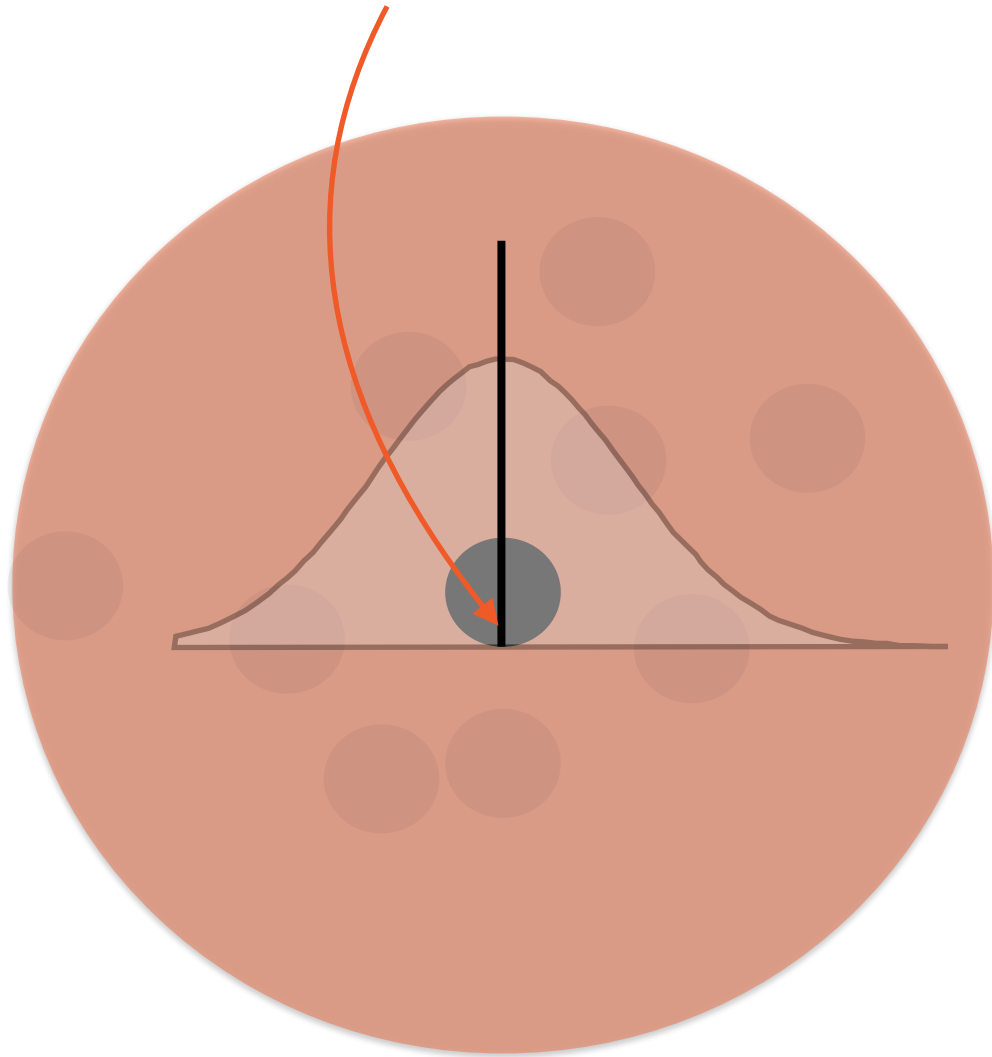
**Gaussian probability distribution**

**Defined by**

- mean  $\mu$
- standard deviation  $\sigma$

# Gaussian Kernel

Mean = Center point



Mean  $\mu$  = center point

Standard deviation  $\sigma \sim$  bandwidth

(Bandwidth is a hyperparameter)

# Demo

**Visualizing univariate data using histograms, KDE plots and Rug plots**

**Visualizing bivariate relationships using scatter plots and hex bin plots**

# Demo

**Visualizing continuous and categorical data using different plots in Seaborn**

# Demo

**Visualizing and customizing pairwise relationships using the PairGrid**



# Demo

**Visualizing multiple relationships using  
facets**

# Summary

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