

**Learn By Example: Seaborn**

# Overview



## Visualizing relationships

- Univariate and bivariate relationships
- Histograms, KDE curves, scatter plots
- Facet grid and pair grid

## Plot aesthetics and style

- Themes, color palettes

# Software and Skills



Be very comfortable programming in Python (Python 3)

Be comfortable working with Jupyter notebooks

Understand high school matrix operations

# Demo

Installing Seaborn

Exploring Pokemon Dataset

# Matplotlib

Tries to make easy things easy and hard things possible. You can generate plots, histograms, power spectra, bar charts, errorcharts, scatterplots, etc., with just a few lines of code.

[matplotlib.org](https://matplotlib.org)

# 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

Two APIs - Matplotlib API (low-level) and Pyplot (higher level)

Production-level aesthetics possible, but need use of Matplotlib API

## Seaborn

Built atop Matplotlib and tightly integrates with Pydata

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

Even higher level than Pyplot (used alongside it)

Production-level aesthetics without need for low-level API

# 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)

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(Module)

Pylab (Module)

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# Matplotlib and Seaborn

Seaborn  
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Built on top  
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# Matplotlib and Seaborn

Seaborn  
(Package)

Tightly integrates with  
PyData stack

Matplotlib  
(Package)

matplotlib.pyplot  
(Module)

Pylab (Module)

Object level APIs ("Matplotlib APIs")

Pandas  
(Package)

Numpy  
(Package)

PyData  
(stack)

...

# Matplotlib and Seaborn

Seaborn  
(Package)

Inter-operates with Pandas,  
Numpy...

Matplotlib  
(Package)

matplotlib.pyplot  
(Module)

Pylab (Module)

Object level APIs ("Matplotlib APIs")

Pandas  
(Package)

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PyData  
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...

# Matplotlib and Seaborn

Seaborn  
(Package)

Matplotlib is a complex package  
that includes multiple modules

Matplotlib  
(Package)

matplotlib.pyplot  
(Module)

Pylab (Module)

Object level APIs ("Matplotlib APIs")

Pandas  
(Package)

Numpy  
(Package)

PyData  
(stack)

...

# Matplotlib and Seaborn

Seaborn  
(Package)

Includes granular low-level APIs to  
control each object in a plot

Matplotlib  
(Package)

matplotlib.pyplot  
(Module)

Pylab (Module)

Object level APIs ("Matplotlib APIs")

Pandas  
(Package)

Numpy  
(Package)

PyData  
(stack)

...

# Matplotlib and Seaborn

Seaborn  
(Package)

Also includes a higher level API  
that controls the “state-machine”

Matplotlib  
(Package)

matplotlib.pyplot  
(Module)

Pylab (Module)

Object level APIs (“Matplotlib APIs”)

Pandas  
(Package)

Numpy  
(Package)

PyData  
(stack)

...

# Matplotlib and Seaborn

Seaborn  
(Package)

Pylab is a convenience module that pulls in  
objects into single namespace

Matplotlib  
(Package)

matplotlib.pyplot  
(Module)

Pylab (Module)

Object level APIs ("Matplotlib APIs")

Pandas  
(Package)

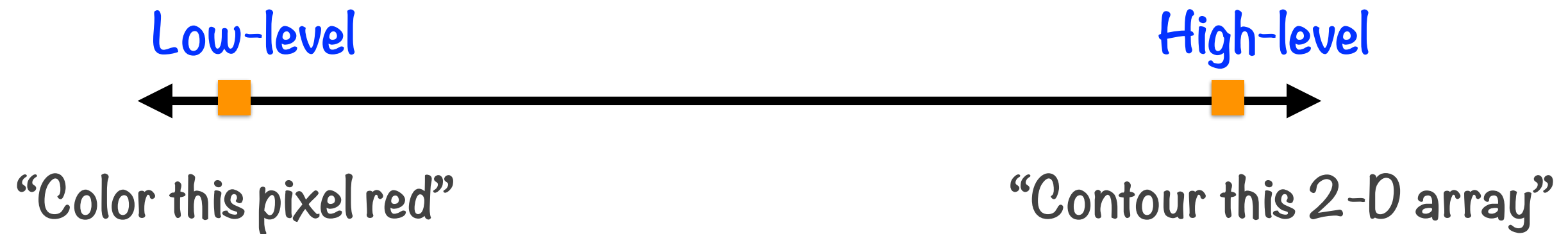
Numpy  
(Package)

PyData  
(stack)

...



# Hierarchy of Plotting Operations



Low-level operations act on specific plot elements, high-level operations act on plot as a whole

This hierarchy is formalized in the Matplotlib codebase

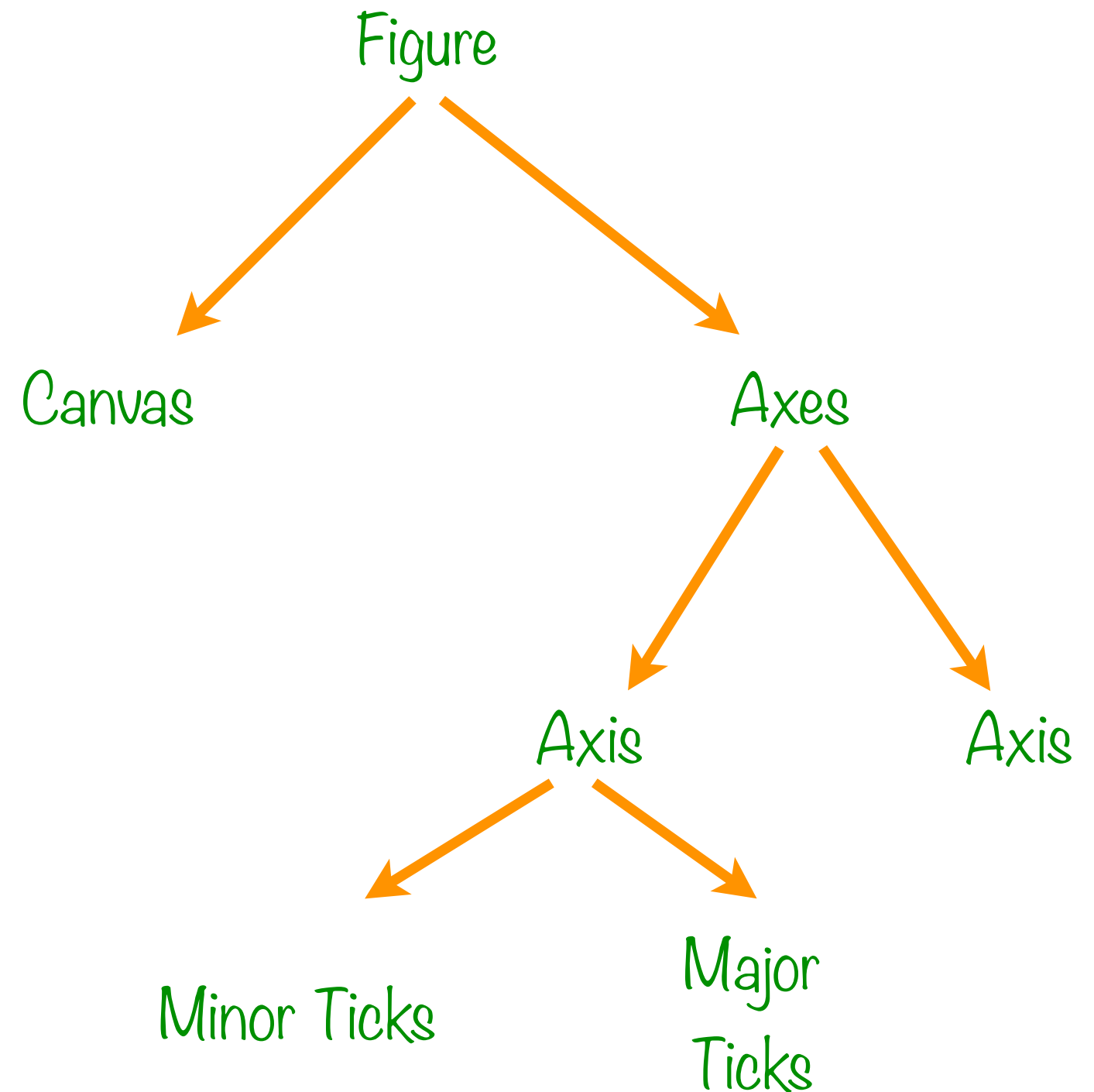
# Hierarchy

Everything is an “Artist”

Artists are arranged in a hierarchy

Artist is an abstract base class

Figure is a container class

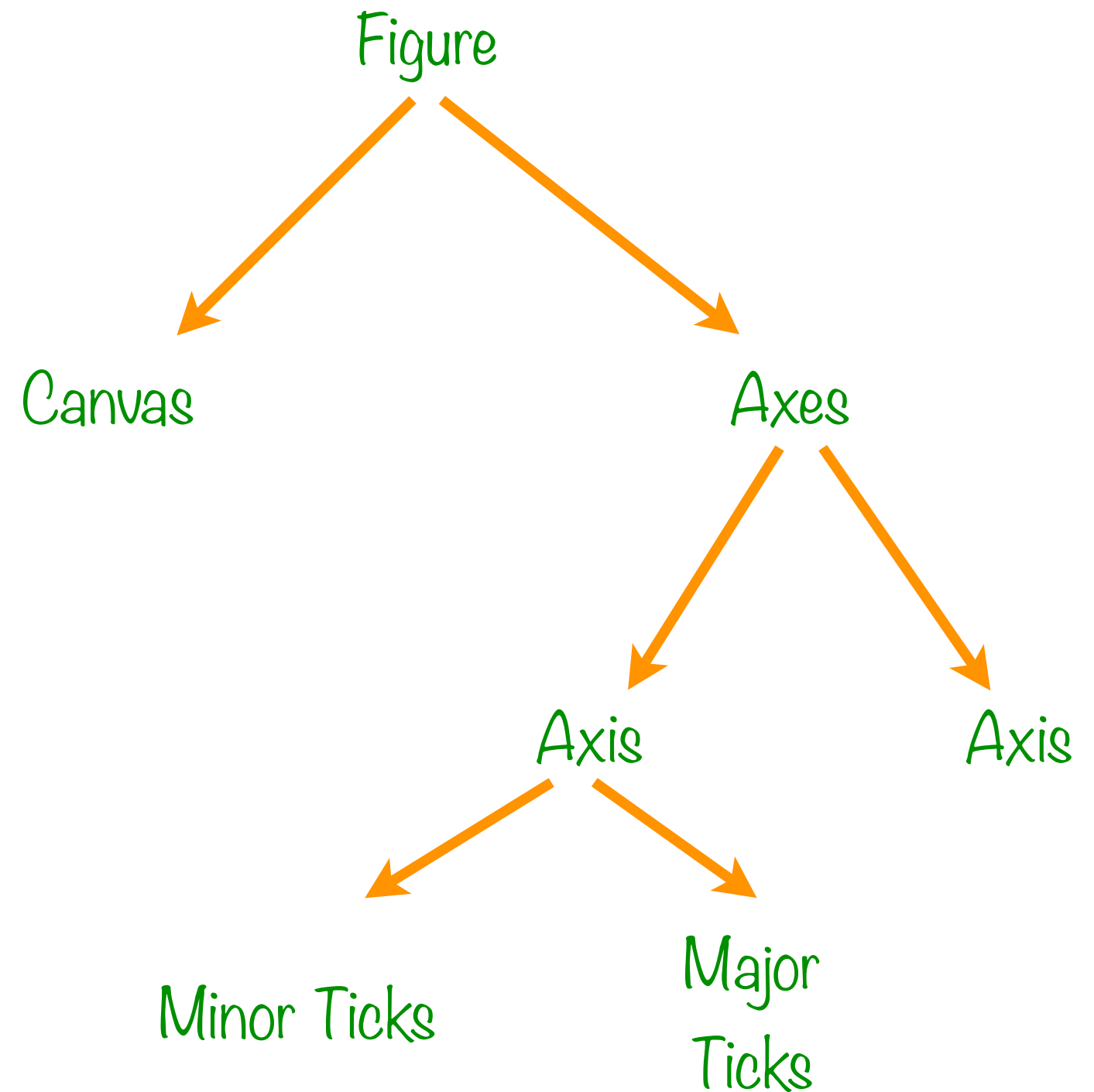


# Hierarchy

Figure is a top-level  
container

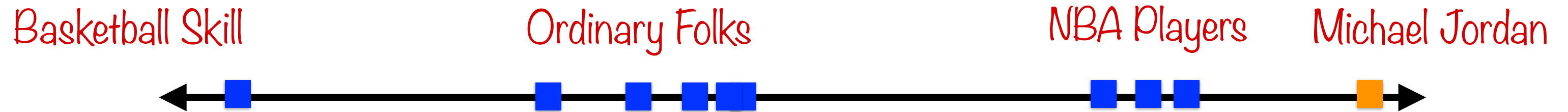
PyPlot APIs operate at higher  
levels

Matplotlib APIs at lower levels



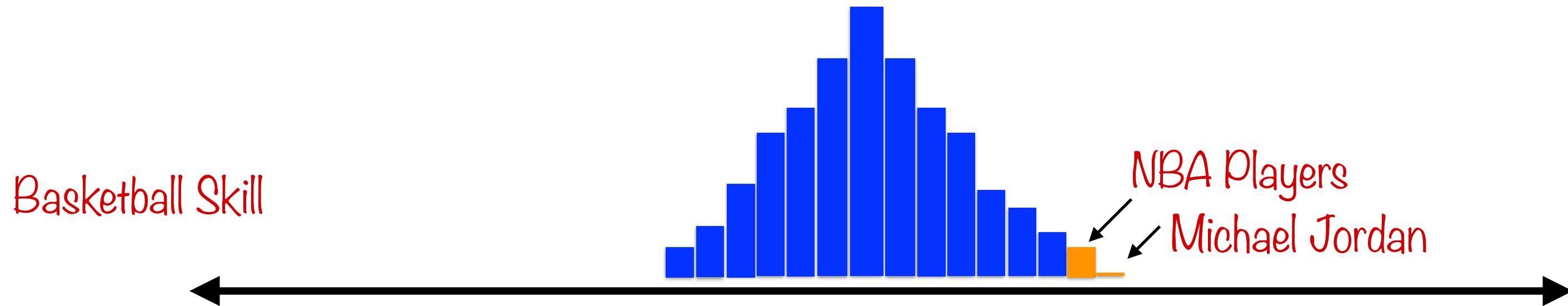
“Michael Jordan is a once-in-a- lifetime  
player”

# Outliers



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

# Outliers

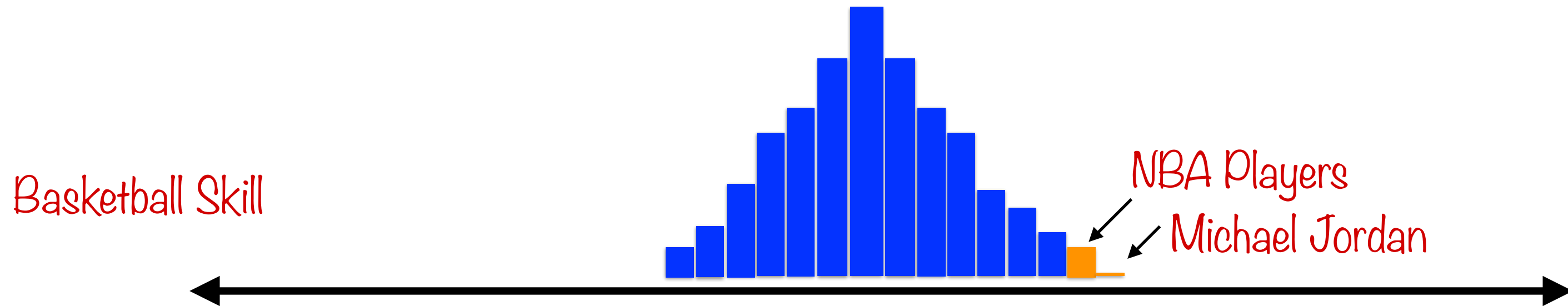


In reality, most ordinary folks would be clustered around an average level of skill

The NBA players would be outliers

Michael Jordan would be an even greater outlier

# Outliers

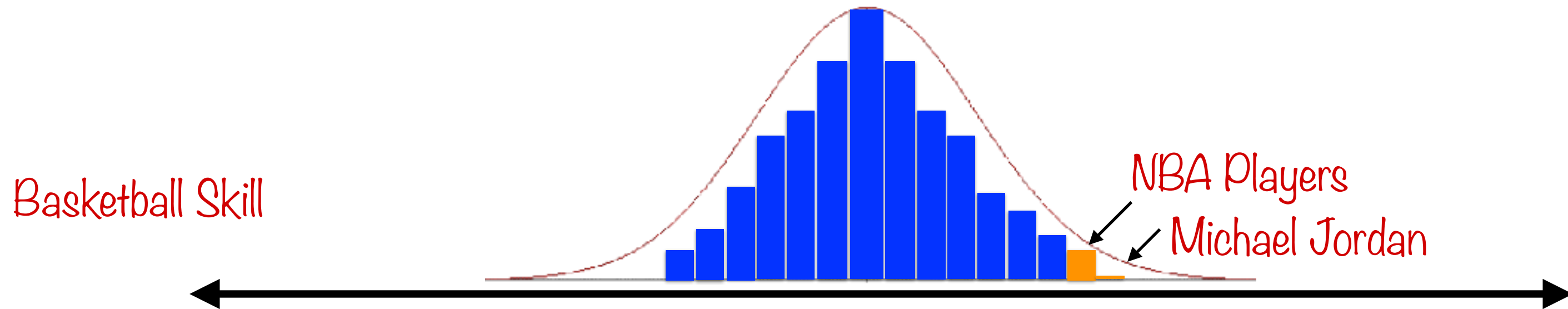


This chart above tells us how common a specific level of skill is

The shape of this chart resembles a bell

This is a Normal Probability Distribution

# Outliers



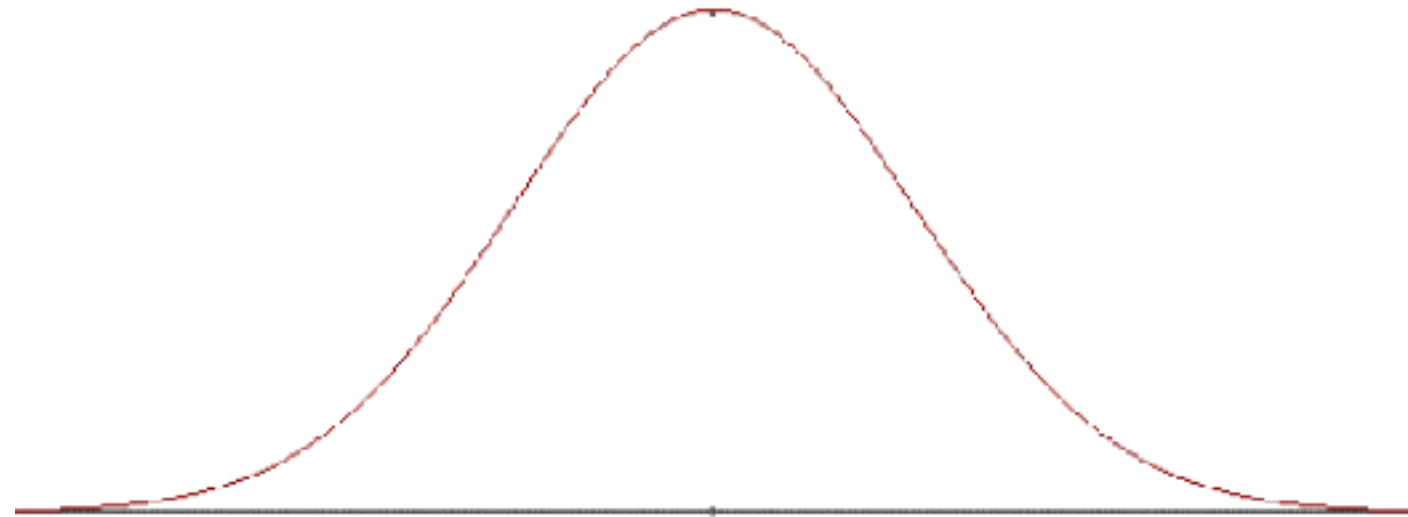
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# Outliers

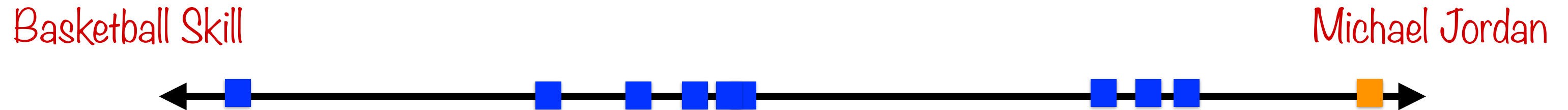


Average is common

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?

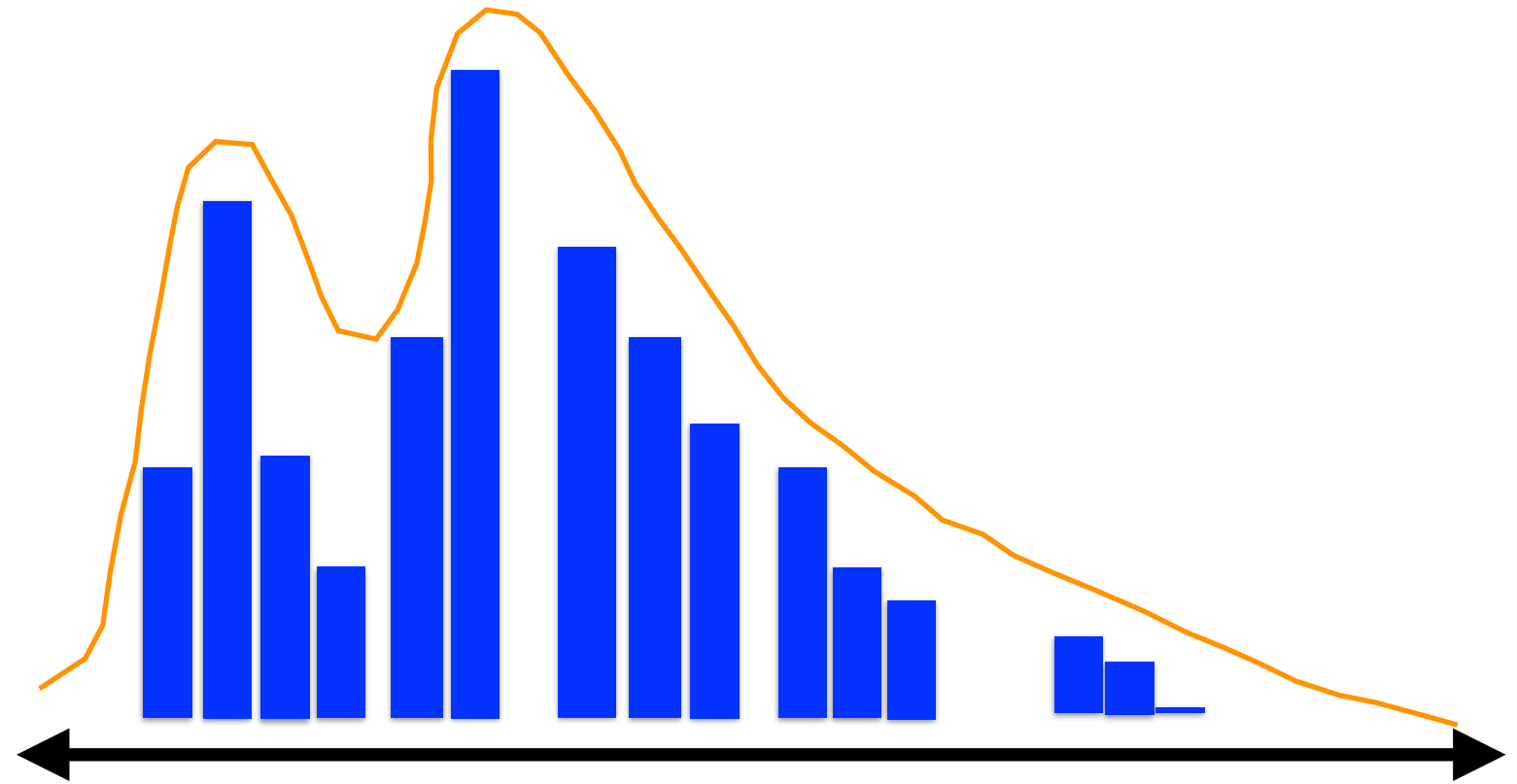
The answer lies in a **probability distribution function**

# Kernel Density Estimation

Given a set of points

Figure out their probability  
distribution

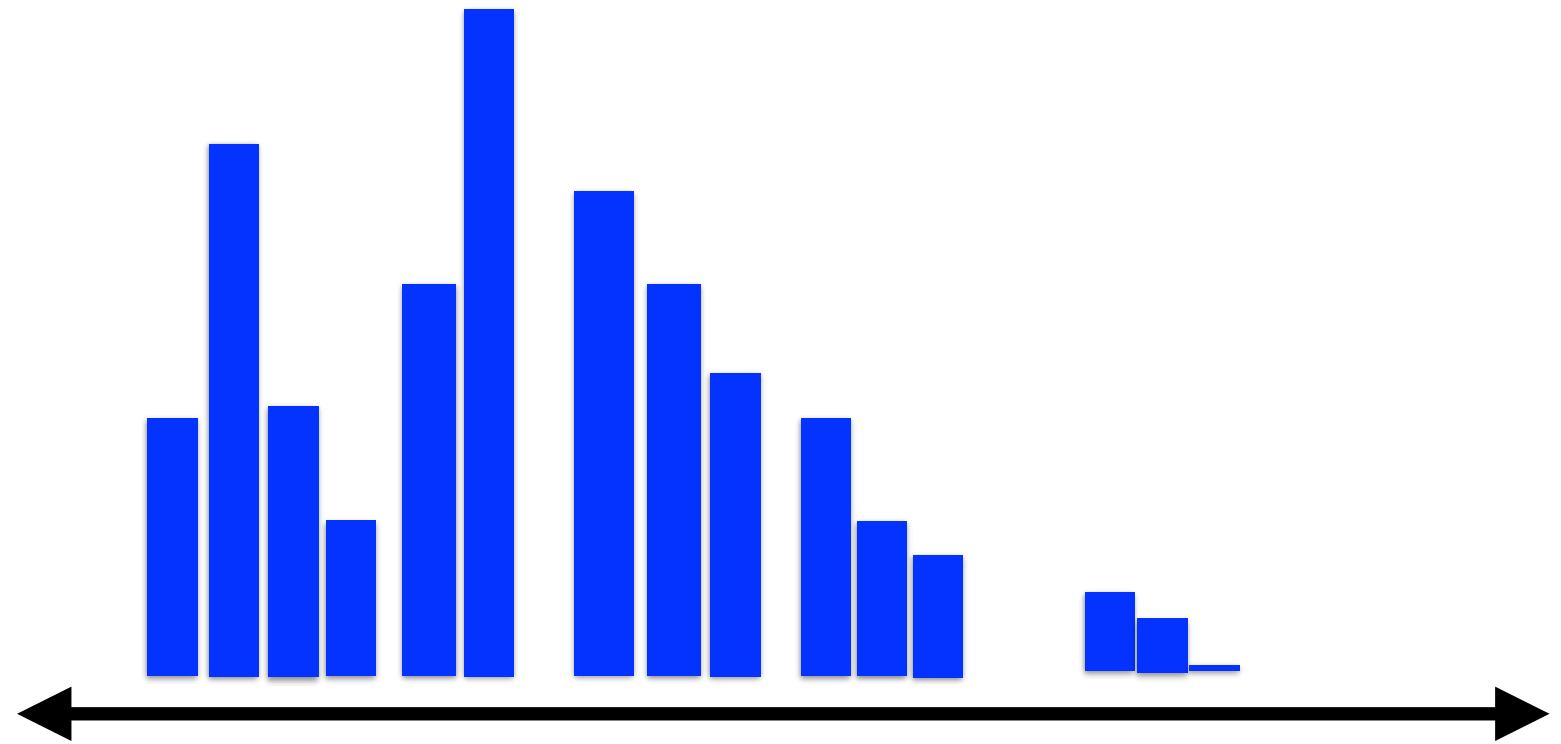
Area under curve must sum to 1



# Kernel Density Estimation

KDE is a standard technique

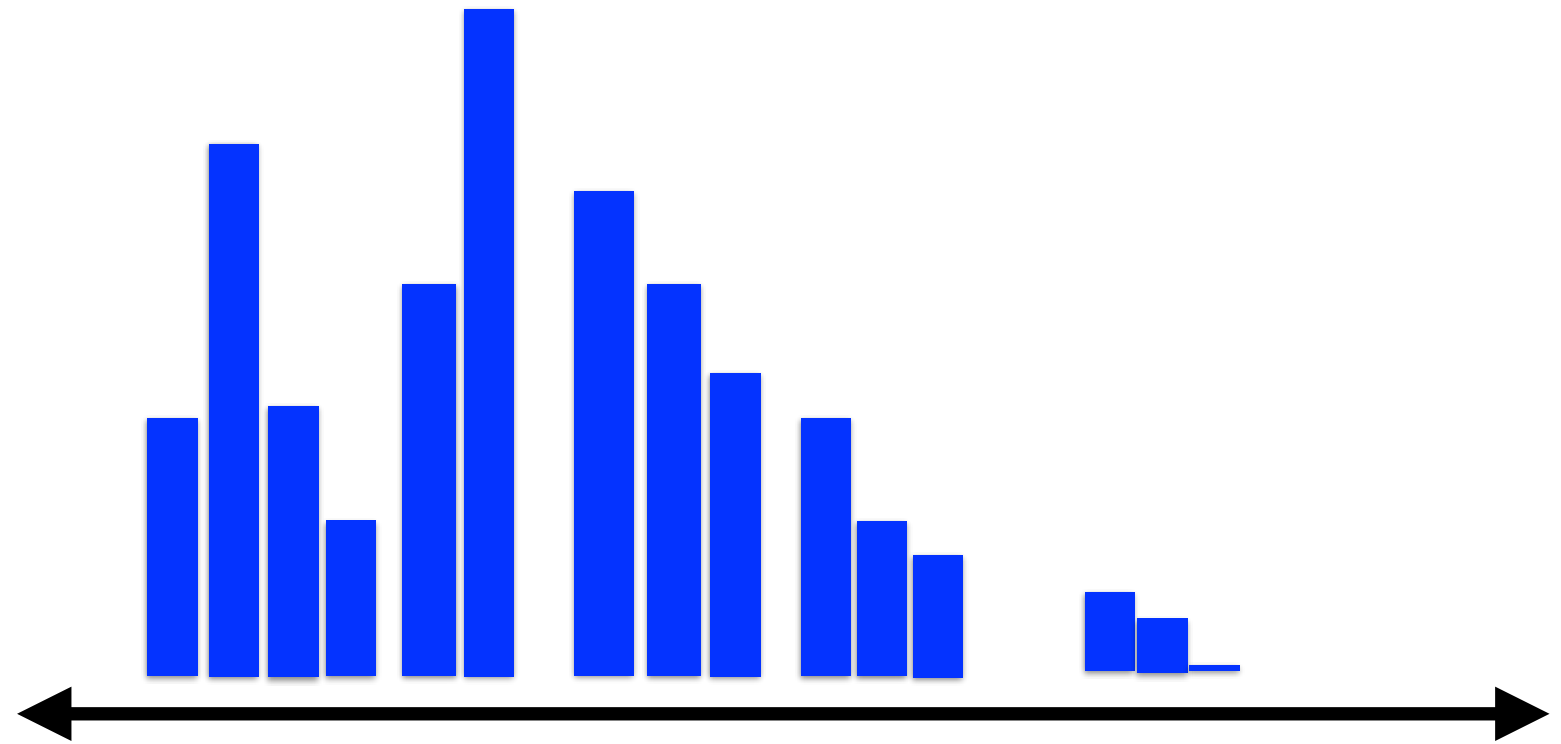
Non-parametric “Smoothing”  
technique



# Kernel Density Estimation

Assume points have same  
distribution

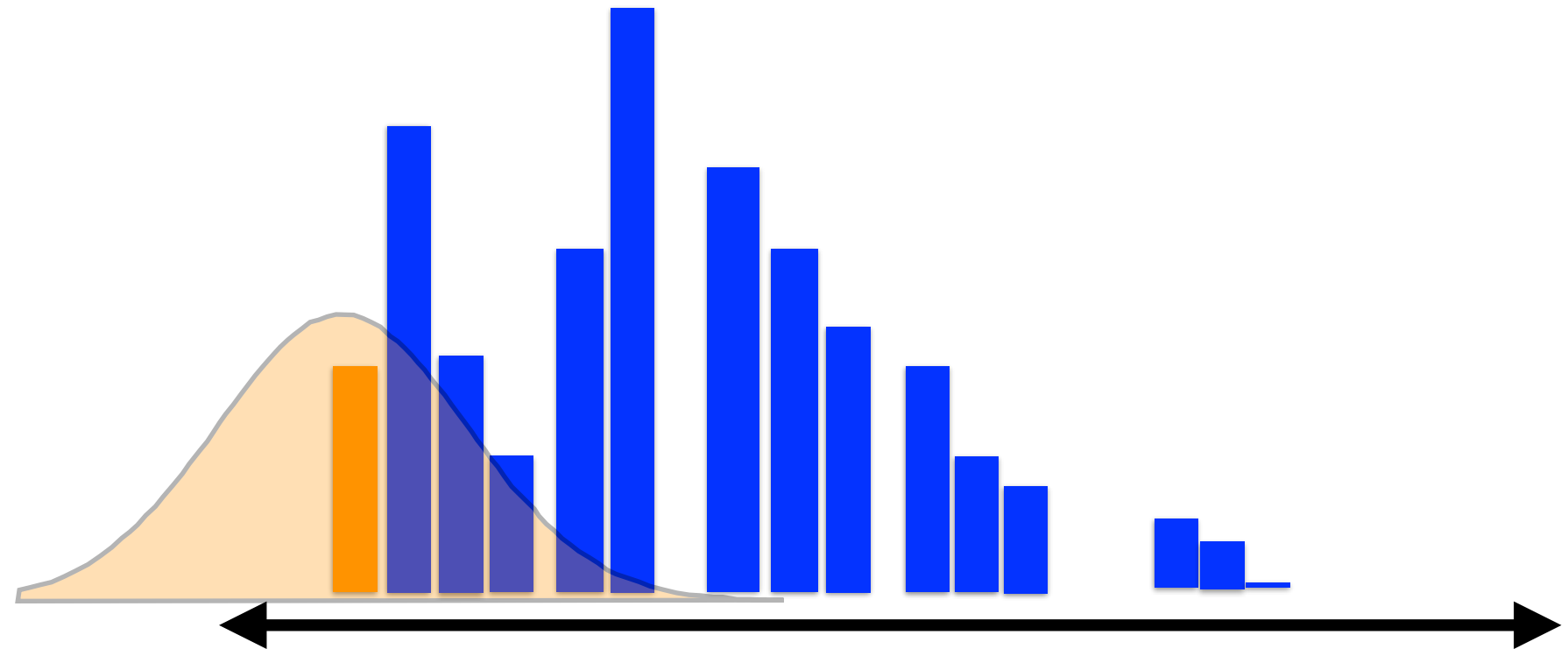
“Independent Identically  
Distributed”



# Kernel Density Estimation

Assume points have same  
distribution

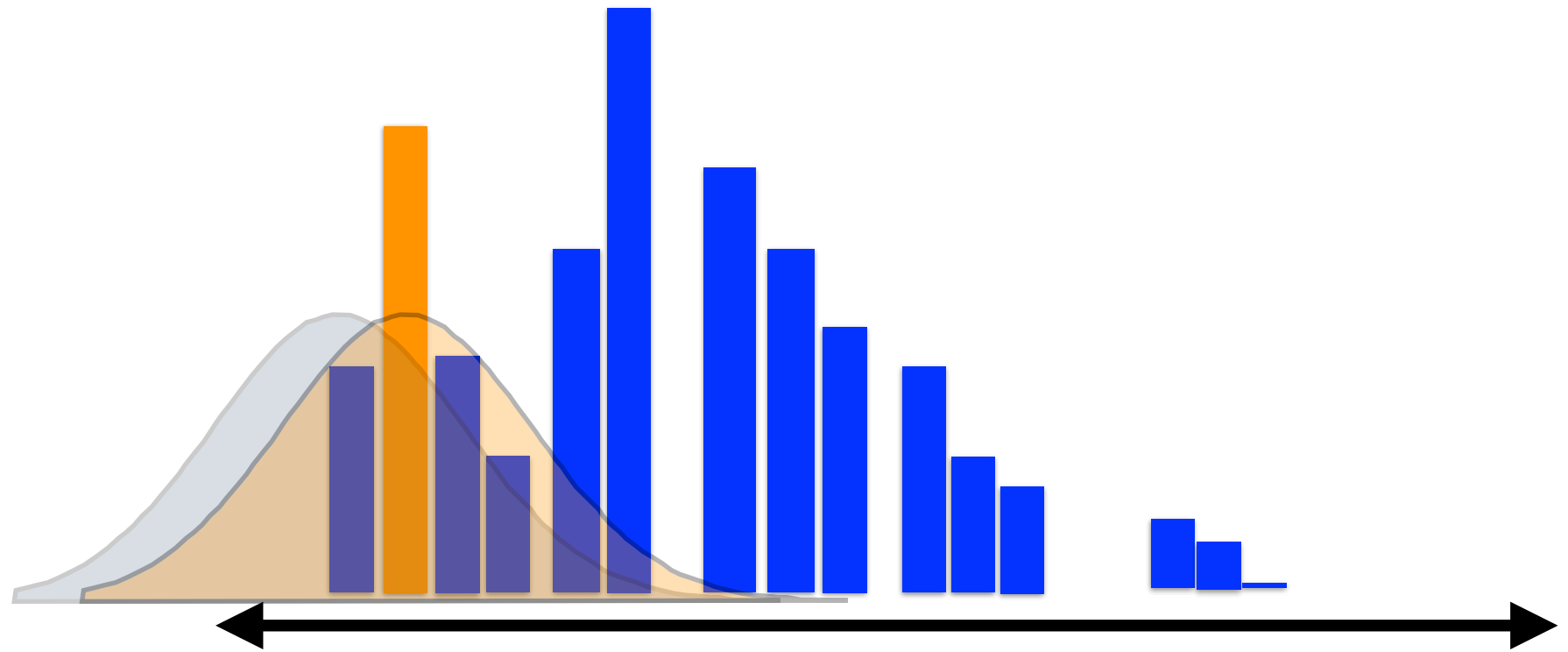
“Independent Identically  
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# Kernel Density Estimation

Assume points have same  
distribution

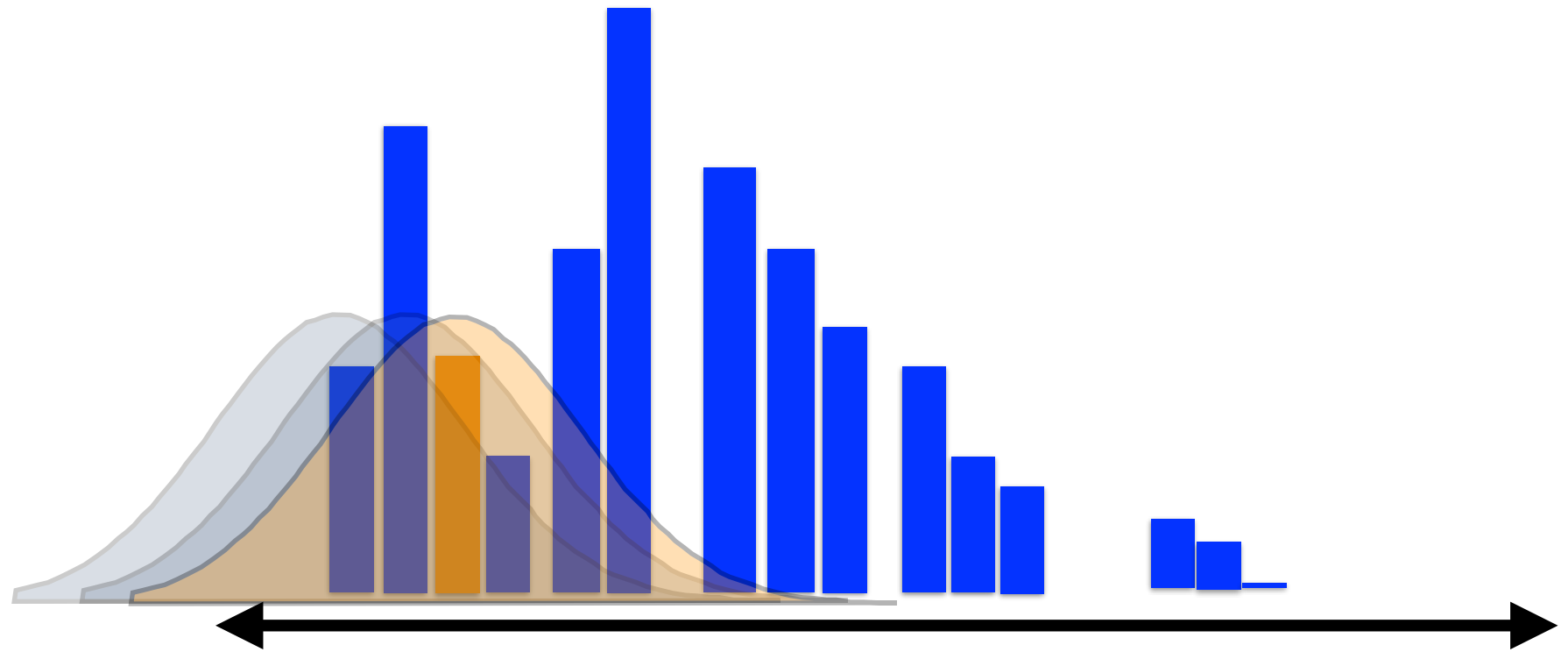
“Independent Identically  
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# Kernel Density Estimation

Assume points have same  
distribution

“Independent Identically  
Distributed”

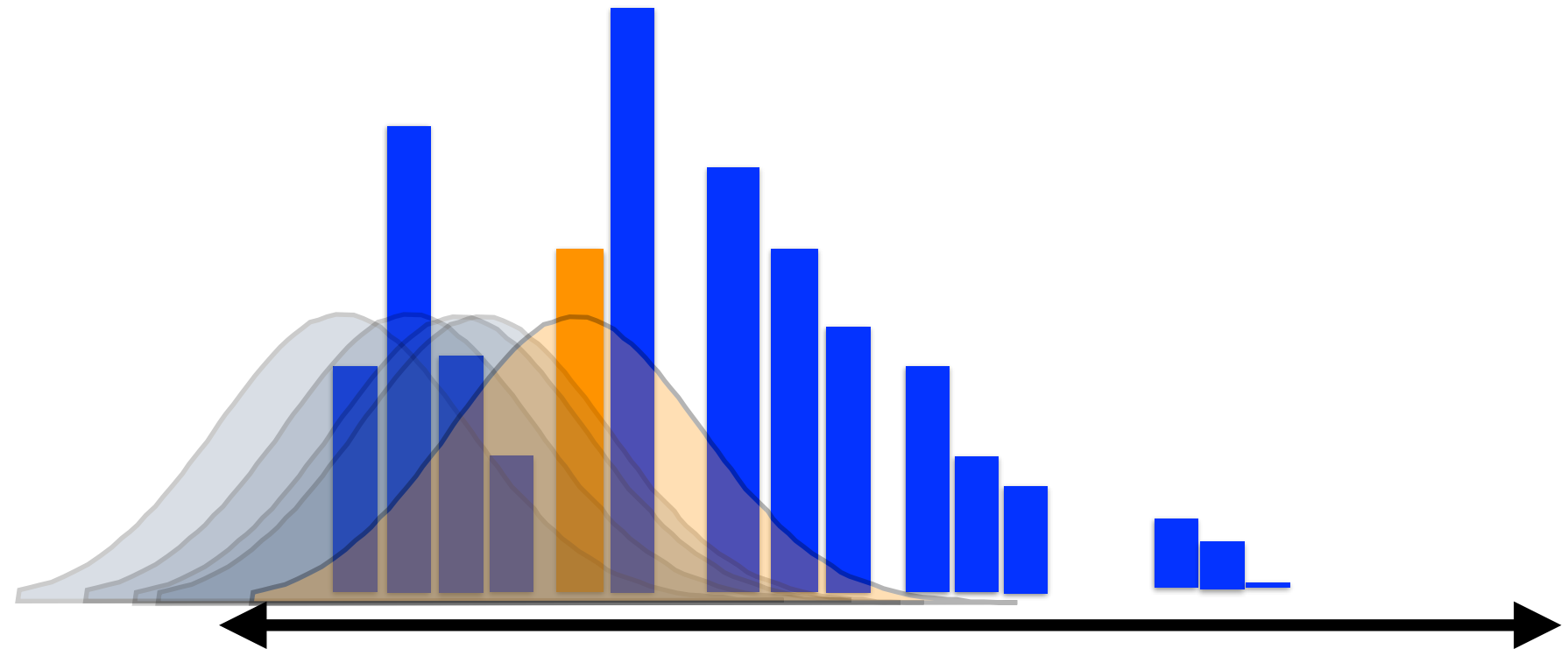




# Kernel Density Estimation

Assume points have same  
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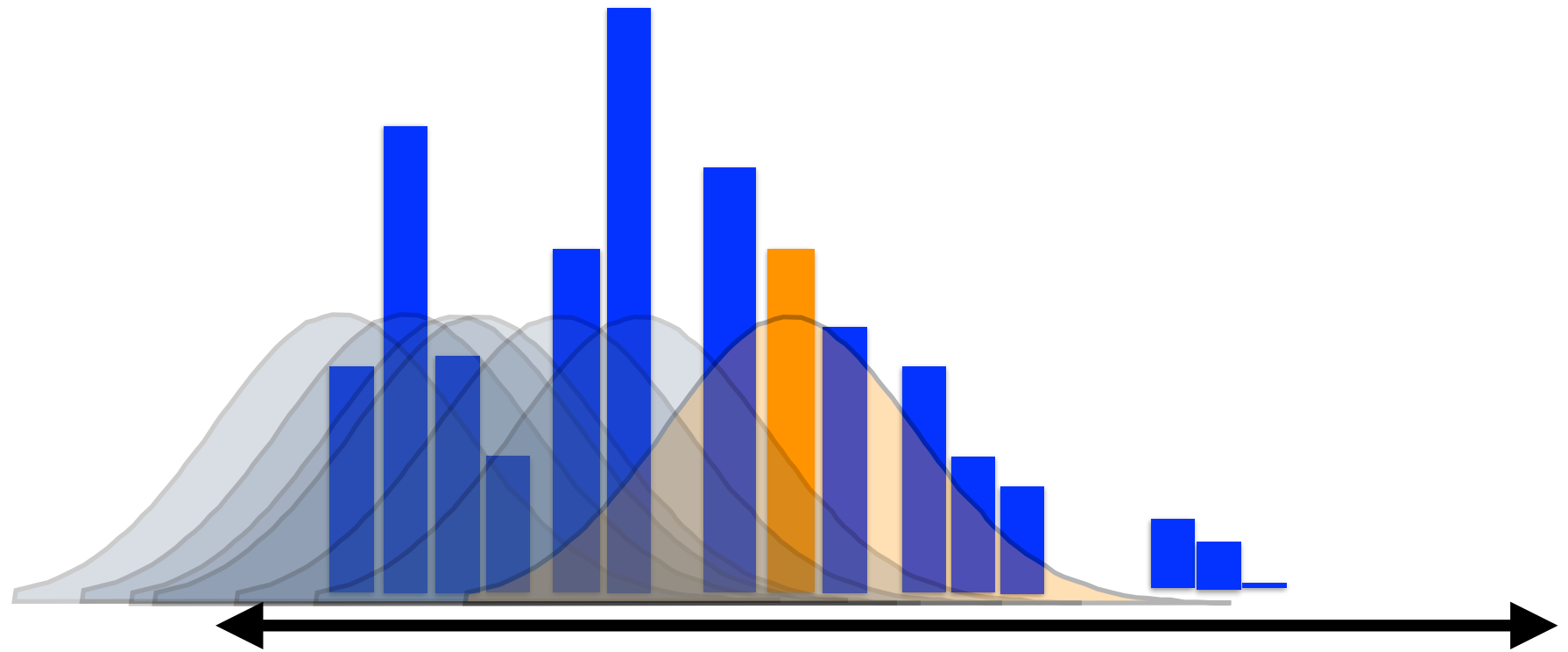
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# Kernel Density Estimation

Assume points have same  
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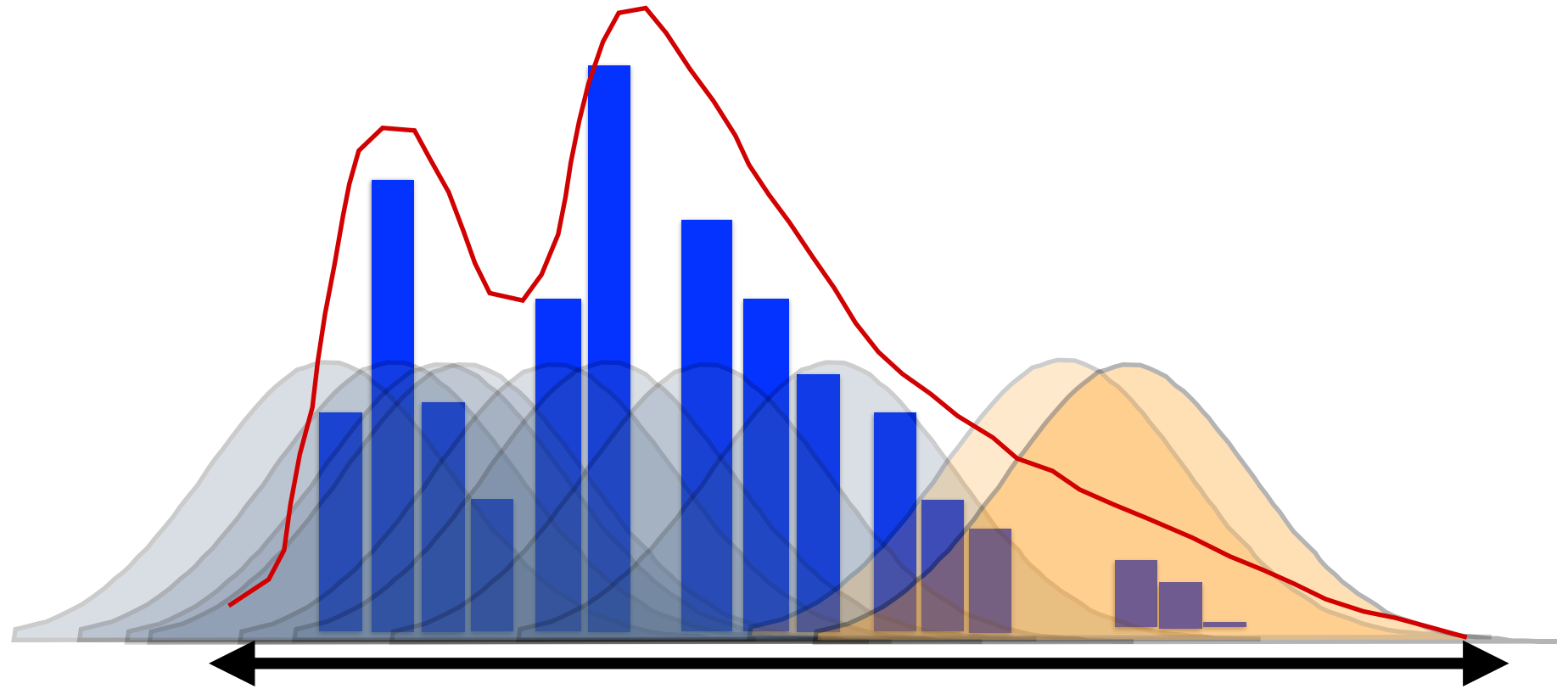
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# Kernel Density Estimation

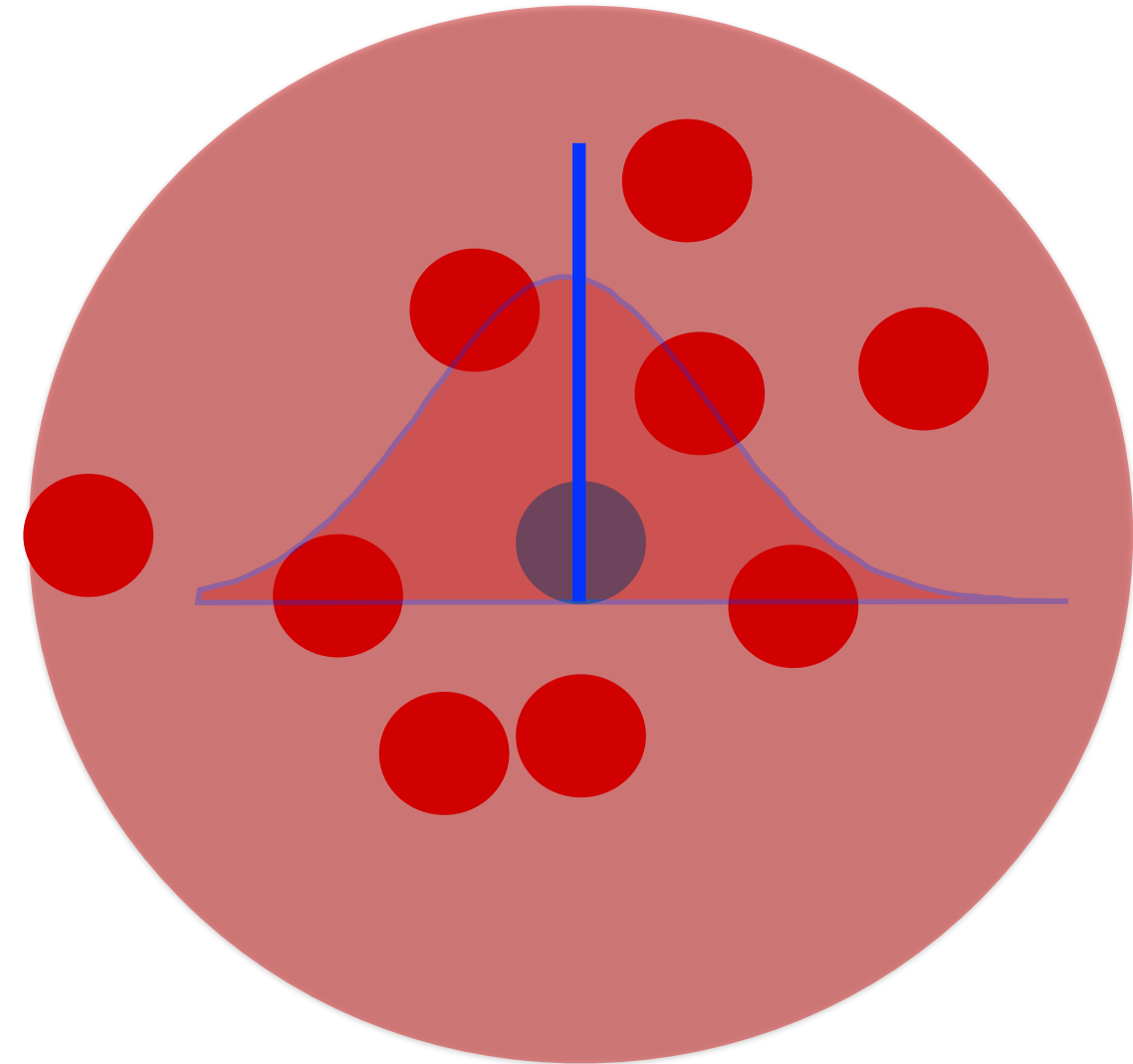
“Sum” them all up

Get resulting PDF of data

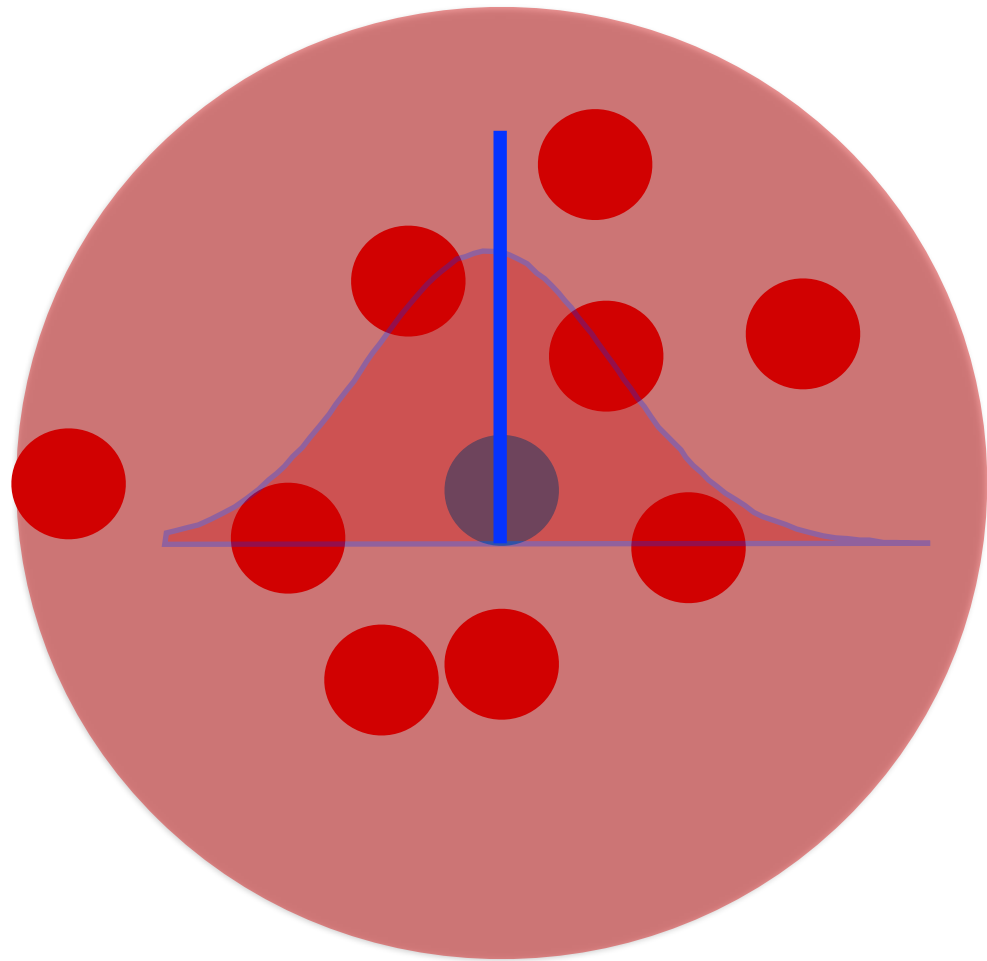


# Kernel Density Estimation

Fit distribution from histogram



# Gaussian Kernel



Gaussian probability distribution

Defined by

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

# Demo

Distplots

KDE plots

# Demo

Implots for linear relationships

Controlling size and shape of plots

Combination plots

# Demo

Categorical plots

Wide form data



# Demo

Working with FacetGrids

# Demo

Customizing FacetGrids

# Demo

Working with PairGrids

# Demo

Exploring a car dataset

# Demo

Themes and figure styles

# Demo

Color palettes

# Demo

Overriding styles

# Summary

Seaborn is a powerful visualization library

Makes “production ready ” plots

Use of histograms, KDE plots, FacetGrids, PairGrids

Specify themes to govern plot aesthetics

Utilize different color palettes