



## Agenda

### Recap:

- Overview
- Distribution of breweries
- Address missing values
- Analyze ABV and IBU

IPA vs Ale classification IPA vs Ale by State





### Overview

Objective: Provide analysis on breweries in the United States with a focus on impact of International Bitterness Unit (IBU) and Alcohol Beer Volume (ABV).

#### **Brewery Dataset**

- » 558 breweries
- » Brewery name
- » City and state

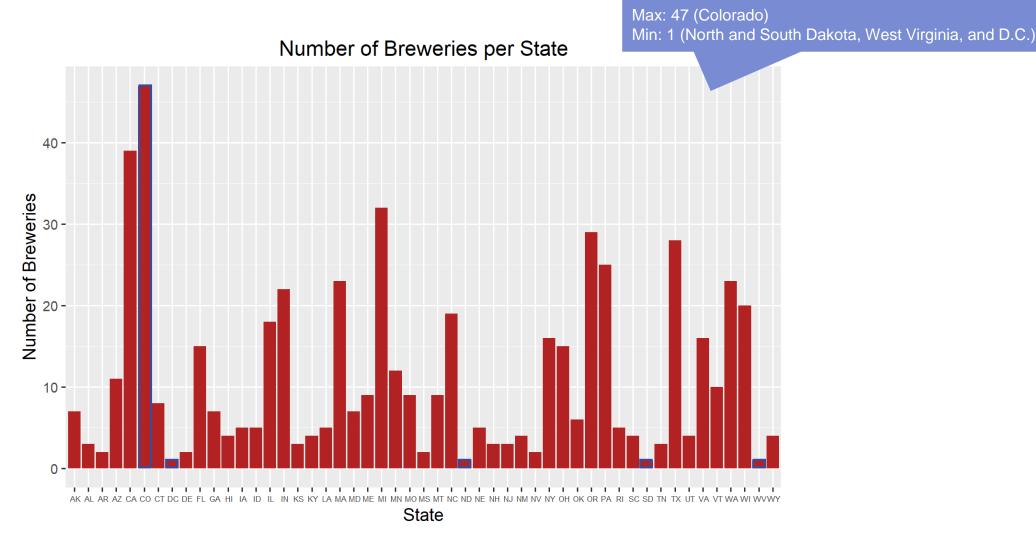
#### **Beer Dataset**

- » Contains 2410 US craft beers
- » IBU: International Bitterness Units of the beer
- » ABV: Alcohol by volume of beer





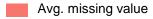
## Significant difference in number of breweries across the nation

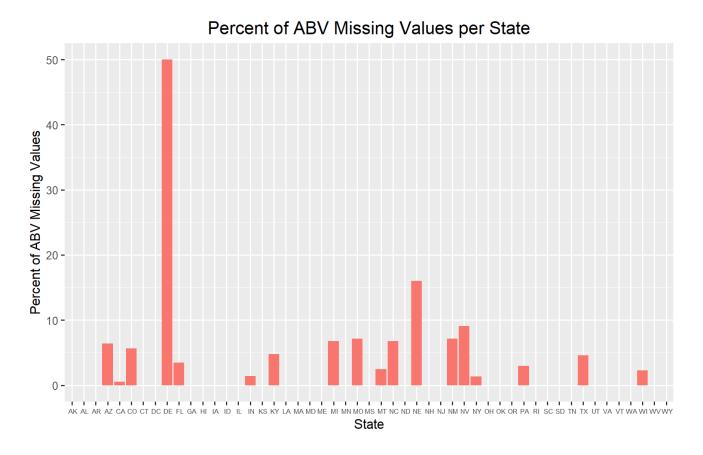






# **ABV Missing Values**





#### **Address Missing Values**

- Total of 62 missing values accounting for ~2.6% of data
- Missing Completely at Random (MCAR)
  - Missingness of ABV does not appear to be dependent on any other variables

#### Imputation Method

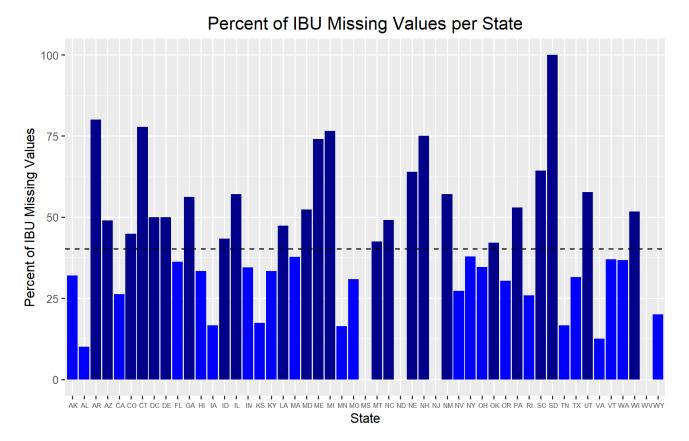
- Replace missing values for ABV with the overall average
  - Mean ABV imputation: 0.05977





## IBU Missing Values

- Above avg. missing values
  Below avg. missing values
- --- Avg. missing values



#### Address Missing Values

- 1,005 missing values accounting for ~42% of data
- Missing Completely at Random (MCAR)
- Missingness of IBU does not appear to be dependent on any other variables

#### Imputation Method

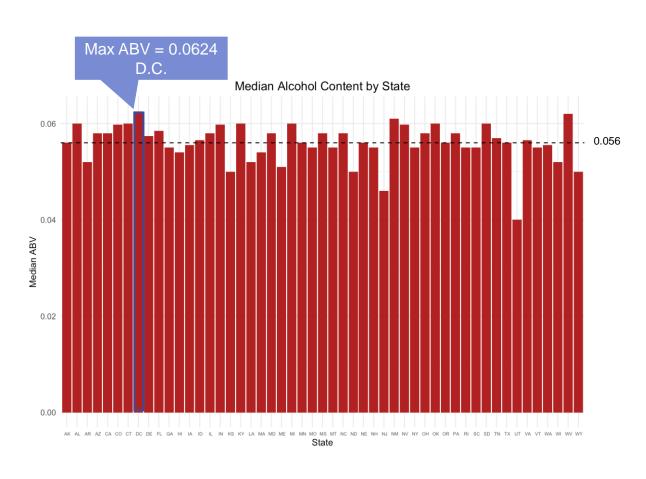
- Multiple mean imputation
- Replace missing values for IBU with the separate averages for states with above and below average.
  - Mean IBU imputation <u>above</u> average: 42.04
  - Mean IBU imputation <u>below</u> average: 43.08

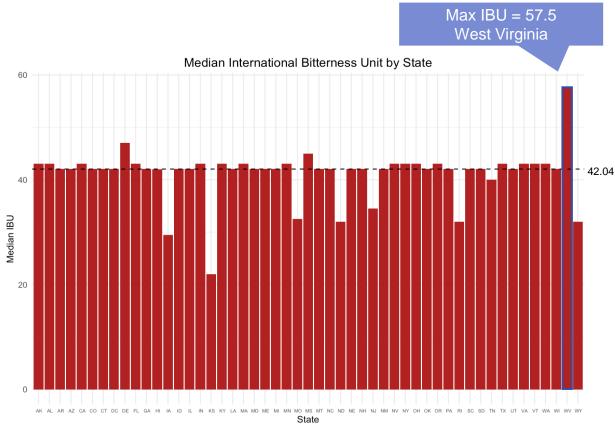




# Median ABV & IBU per state

--- Median





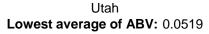


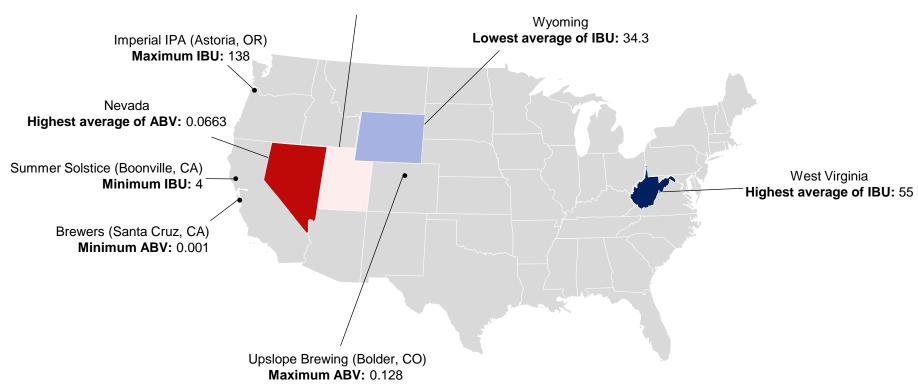


### Statistics of ABV and IBU

\*Average ABV: 0.06 \*Median ABV: 0.057

\*Average IBU: 42.6 \*Median IBU: 42.04

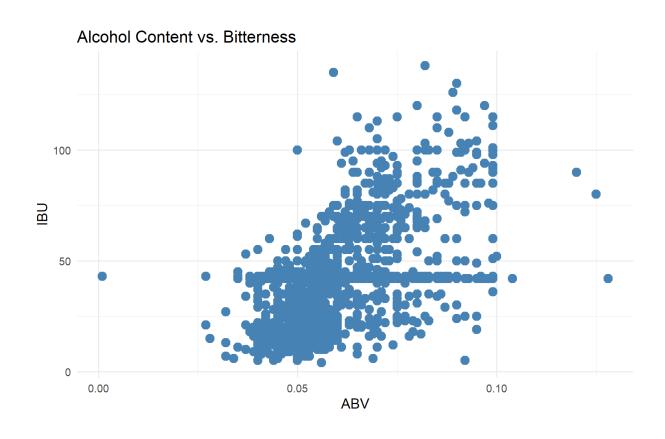








### Alcohol content vs. bitterness



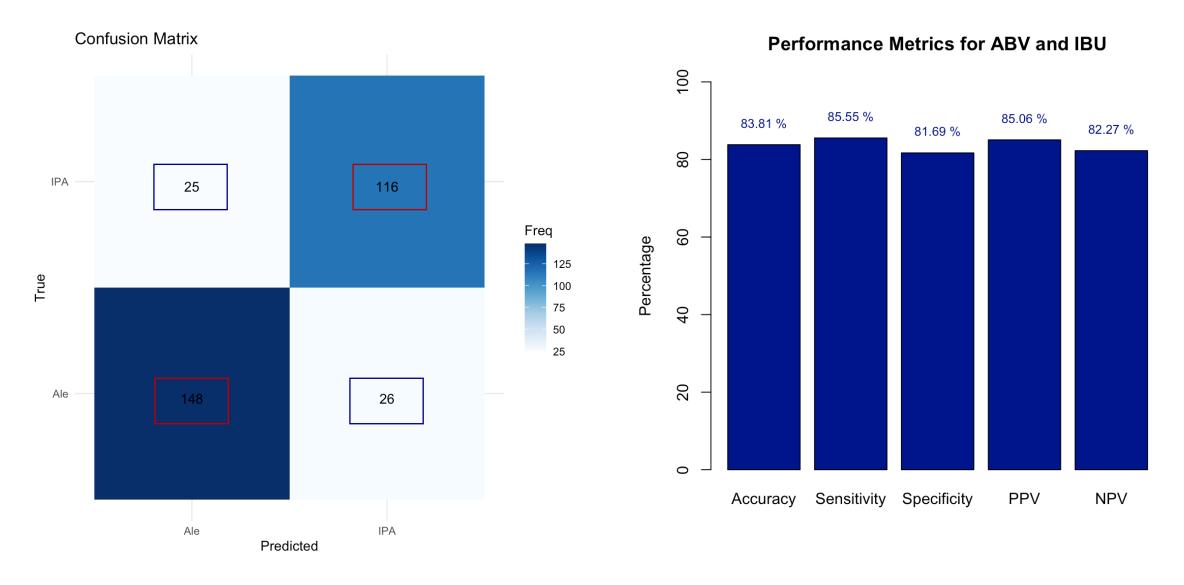
An increase in alcohol content (ABV) does appear to be <u>associated</u> with bitterness (IBU)

\*Note: Increase in ABV does not cause in IBU or vice versa





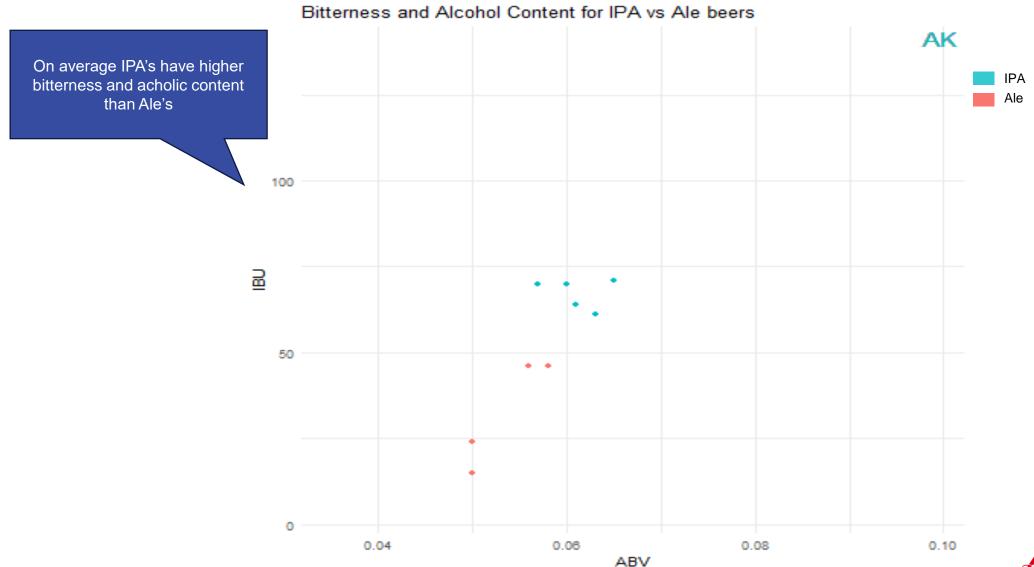
## IPA vs Ale classifications







### IPA vs Ale bitterness and alcohol content







# **Thank You!**



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## Video link

https://youtu.be/o5Lu5PT98v4

