### Beer Recipes, Part II: Model and Results

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Model

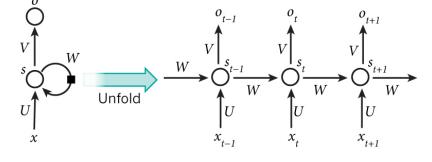
Results

**Improvements** 

**Bibliography** 

### Model

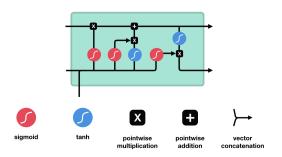
### **Recurrent Neural Networks**



**Figure 1:** http://www.wildml.com/2015/09/recurrent-neural-networks-tutorial-part-1-introduction-to-rnns/

• Great for sequential data

### **Long Short-Term Memory**



**Figure 2:** https://towardsdatascience.com/illustrated-guide-to-lstms-and-gru-s-a-step-by-step-explanation-44e9eb85bf21

• Better at processing longer sequences

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### Our Model

- RNN with LSTM
- Trained its own embeddings
- Ran for 4 hours
  - 100 steps per epoch for 68 epochs

### **Results**

### A Lot of Caramel

```
Attempt: Outlet IPA + 0.2
NAME
Outlet IPA
STYLE
American IPA
METHOD
All Grain
INGREDIENTS
    FERMENTABLES
                3 lb American - Pale 2-Row
                1 lb American - Caramel / Crystal 20L
                0.50 lb American - Caramel / Crystal 120L
                0.50 lb American - Caramel / Crystal 120L
        HOPS
                1.50 oz Columbus, Pellet, Boil, 60 min
                1 oz Citra, Pellet, Boil, 15 min
                1 oz Citra, Pellet, Boil, 10 min
                1 oz Citra, Pellet, Boil, 5 min
                1 oz Citra, Pellet, Boil, 1 min
                3 oz Citra, Pellet, Dry Hop, 13 days
                3 oz Citra, Pellet, Dry Hop, 14 days
        OTHER
                1 tsp Irish Moss, Fining, Boil, 15 min.
```

### **Ingredients Discrepancies**

```
HOPS

1.50 oz Columbus, Pellet, Boil, 60 min
1 oz Citra, Pellet, Boil, 15 min
1 oz Citra, Pellet, Boil, 10 min
1 oz Citra, Pellet, Boil, 5 min
1 oz Citra, Pellet, Boil, 1 min
3 oz Citra, Pellet, Boil, 1 min
3 oz Citra, Pellet, Dry Hop, 13 days
3 oz Citra, Pellet, Dry Hop, 14 days

OTHER

1 tsp Irish Moss, Fining, Boil, 15 min.

YEAST

Weest - American Ale 1056
```

```
2. THE BOIL
Bring the wort to a rolling boil. Hold there for 60
With 60 min left, Boil 1 oz of Columbus hops.
With 10 min left, Boil 1 oz of Citra hops.
With 10 min left, Boil 1 oz of Citra hops.
With 5 min left, Boil 1 oz of Citra hops.
With 1 min left, Boil 1 oz of Citra hops.
With 1 min left, Boil 1 oz of Citra hops.
With 1 min left, Boil 1 oz of Citra hops.3. THE of Citra hops is the wort to around room tempterature. The of the wort to around room tempterature. The office of the wort to around room tempterature is the wort cover your fermenter, fill the airlock to the life fermentation times vary by style of beer. Make so with 5 days left, Dry Hop 1 oz of Citra hops.
With 3 days left, Dry Hop 1 oz of Citra hops.
```

With 3 days left, Dry Hop 1 oz of Citra hops.

With 3 days left, Dry Hop 1 oz of Citra hops. With 3 days left, Dry Hop 1 oz of Mosaic hops.

With 3 days left, Dry Hop 1 oz of Citra hops.

With 3 days left, Dry Hop 1 oz of Mosaic hops.

### **Extract Recipe**

#### 1. THE MASH

Heat 7.5 gallons of water to about 160 degrees in your brew kettle.

Add your grains to your grain bag.

Once the water reaches the desired temperature, add the grains to the water, and turn off the heat. Stir gently to remove clumping, and cover with a lid. Monitor the heat, making sure that it does not get too low.

After about 60 minutes, slowly remove the bag from the wort, letting it drain into the kettle.

• These are mash instructions for brew in bag

### **Varying Temperature**

2. THE BO

Bring the wort to a rolling boil. Hold there for 60 min.

With 10 min left, Boil 0.50 oz of Amarillo hops. With 5 min left, Boil 1 oz of Willamette hops. With 5 min left, Socondath 30 min of Phalerid Pumerins.

With 14 min left, Secondary 3 tsp of Vanilla Extract.

With 0 min left, Secondary 3 lb of Vanilla extract.

Mith 0 min left, Secondary 4 1b of Ruma, Spice, Secondary - ST03 dapse ou the swerelouf fire the fromes (1d whiirs Stim 1.50 titer the water for asthe top of the grain bed white shen Once the water is at the desired temperature, turn off the heat, and add the grain bag. Stir the grain bag around the water. Cover and insulate the kettle, letting the mash steep for In another only, thest about as much water as used for the mash to 170 degrees.

Once the mash is done steeping, place the grain bag on a colander on top of the kettle. Slowly pour the water from the second pot over the grains, sparging them until you reach 3 gai Begin heating the kettle until the water reaches 180 degrees. Now, add your malt extract, stirring to make sure it infuses.

2. He BOLL Brille the wort to a roul frome tol 18.7 le ter whor - Saaz Nugrien Flavo MLP842 to the wort, following the instructions given by the yeast manufacturer.

Cover your fermenter, fill the airlock to the line with water, and place the airlock in hole in the fermenter lid.

Fermentation times vary by style of beer. Make sure that you are fermenting for enough time.

### • Literal nonsense

# **Improvements**

### **Training**

- Only used 3,119 out of ~200,000 recipes
  - Took days to get this, with scalable computing and more time, could train more data
- Hyperparameter tuning
  - Did not have time to tune hyperparameters as model training took 4 hours

## **Output Cleaning**

- Remove duplicates in ingredients section.
- Repair disconnect between ingredients and intructions.

# **Bibliography**

Bibliography

### **Sources**

Britz, D. (2016, July 8). Recurrent Neural Networks Tutorial, Part 1 – Introduction to RNNs. WildML.

http://www.wildml.com/2015/09/recurrent-neural-networks-tutorial-part-1-introduction-to-rnns/.

Pascanu, R., Gulcehre, C., Cho, K., Bengio, Y. (2014) How to Construct Deep Recurrent Neural Networks. Department of Information and Computer Sience, Aalto University School of Medicine.

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