# MINSUK CHANG WITH HYEUNGSIK JUNG WITH VIVIAN HARE, JUHO KIM & MANEESH AGRAWALA **RecipeScape: mining and analyzing** diverse processes in cooking





# **DO YOU LIKE CHOCOLATE CHIP COOKIES?**





"<u>There's no such thing as an ideal</u> <u>chocolate chip cookie.</u> At least, not one that we can all agree upon. Like pizzas and hamburgers, <u>the ideal chocolate chip cookie</u> <u>varies from person to person, from mood to</u> <u>mood</u>,"

> J. Kenji López-Alt on Serious Eats



## Recipe sharing online

#### $\equiv$ You Tube

#### chocolate chip cookie

Filters 🔻

About 495,000 results



#### PERFECT Easy Chocolate Chip Cookies Recipe

BakeLikeAPro 2 years ago • 1,641,027 views PERFECT Easy Chocolate Chip Cookies Recipe Easy ! Chocolate Chip Cookies Recipe ! ☆ Please SUBSCRIBE: ...



#### Classic Chocolate Chip Cookies | Oh Yum with Anna Olson

Oh Yum with Anna Olson 6 months ago • 419,420 views Making the classic chocolate chip cookie with Anna Olson. Subscribe for more video recipes: http://goo.gl/MJV4af Anna Olson ...



#### How to Make the Best Chocolate Chip Cookies!

kawaiisweetworld 🜌 2 years ago • 2,772,391 views Hey everyone! This is the best chocolate chip cookie recipe for chewy on the inside, crispy on the outside cookies! These cookies ...





#### The BEST Oatmeal Chocolate Chip Cookies!

Living On A Dime 93 watching Subscribe to Living On A Dime on YouTube! http://bit.ly/1QDDmbN Visit Our Website: http://www.LivingOnADime.com/ Free e-Mail ... LIVE NOW NEW

#### Baking Chocolate Chip Cookies with Shopkins Kooky Cookie from **Official Magazine Recipe**

CookieSwirlC 🜌 7 months ago • 2,884,299 views Let's bake up so Shopkins Chocolate chip cookies using the recipe in the Shopkins Official Magazine #3. Make no egg cookies ...



#### Queen Elsa from Disney Frozen Makes Homemade Chocolate Chip **Cookies - Cookieswirlc Video**

CookieSwirlC

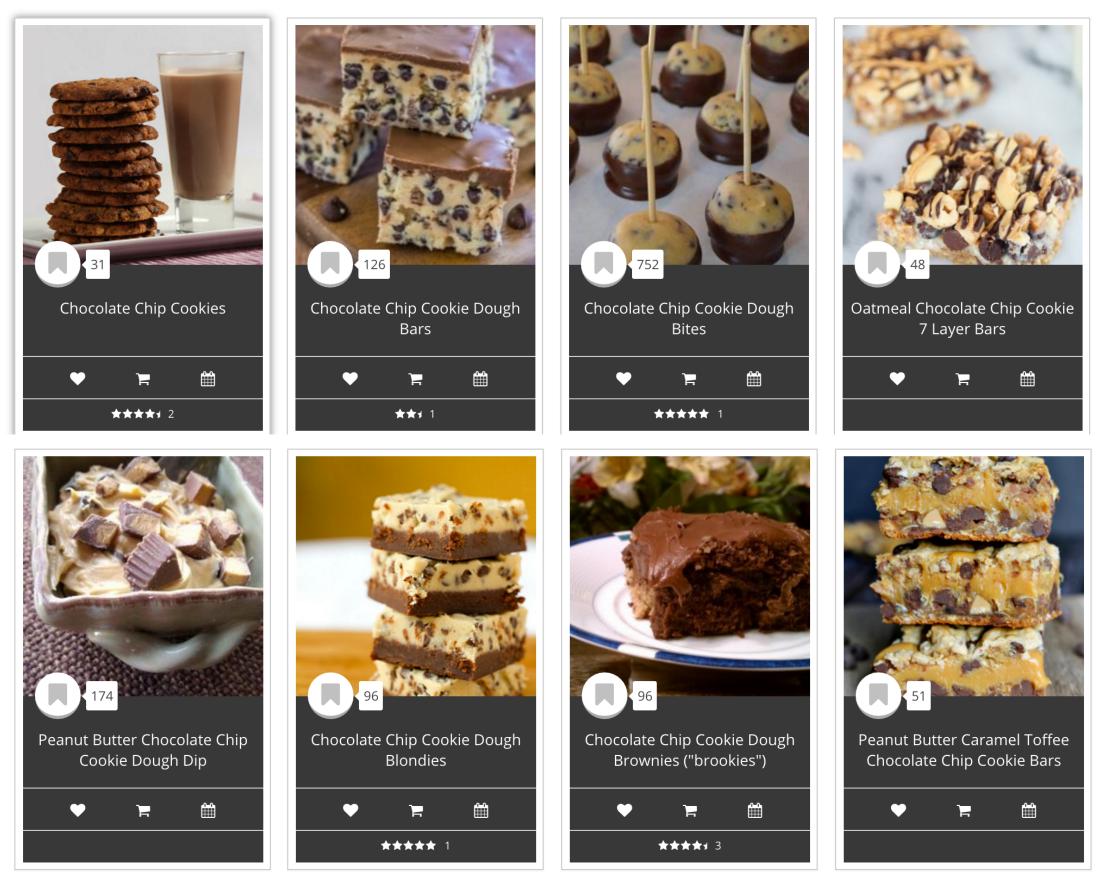
#### chocolate chip cookie recipes

6,526 results

All

**My Recipes** 

Desserts (5,646) Breakfast (48) Other (27) Appetizers (22) Bread (9) Main Dish (6) Drinks (3) Marinades and Sauces (1) Side Dish (1)



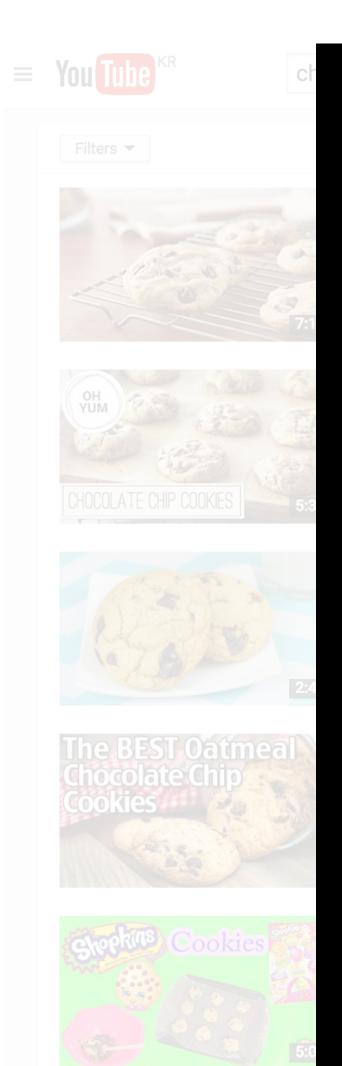






Options

### **Recipe sharing online**



By nature, recipes are: - instructional - procedural - (usually) descriptive

chocolate chip cookie recipes

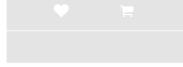






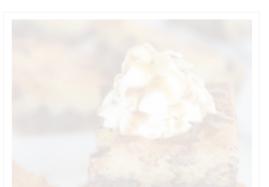








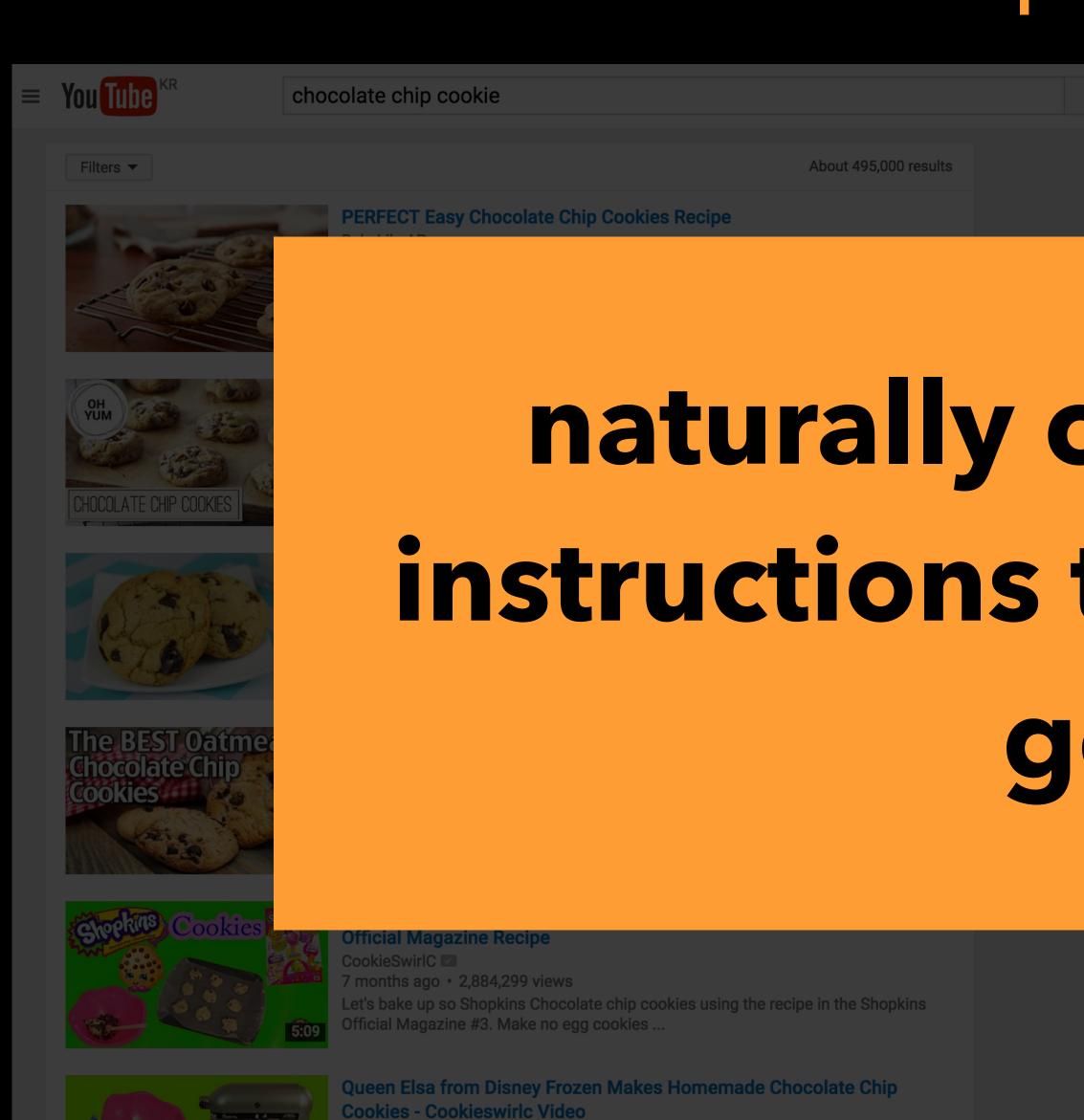






Optior

## **Recipe sharing online**



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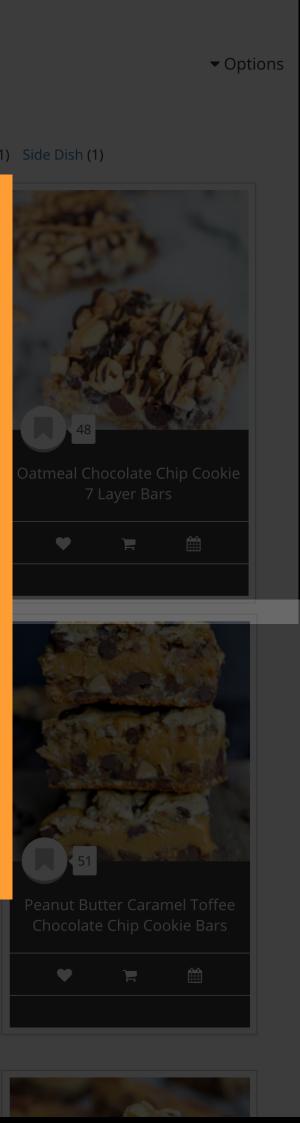
#### chocolate chip cookie recipes

# naturally crowdsourced instructions toward a shared goal !!





| • |  |
|---|--|
|   |  |



# **"Proportion of ingredients is** important, but the final result is also a matter of how you put them together."



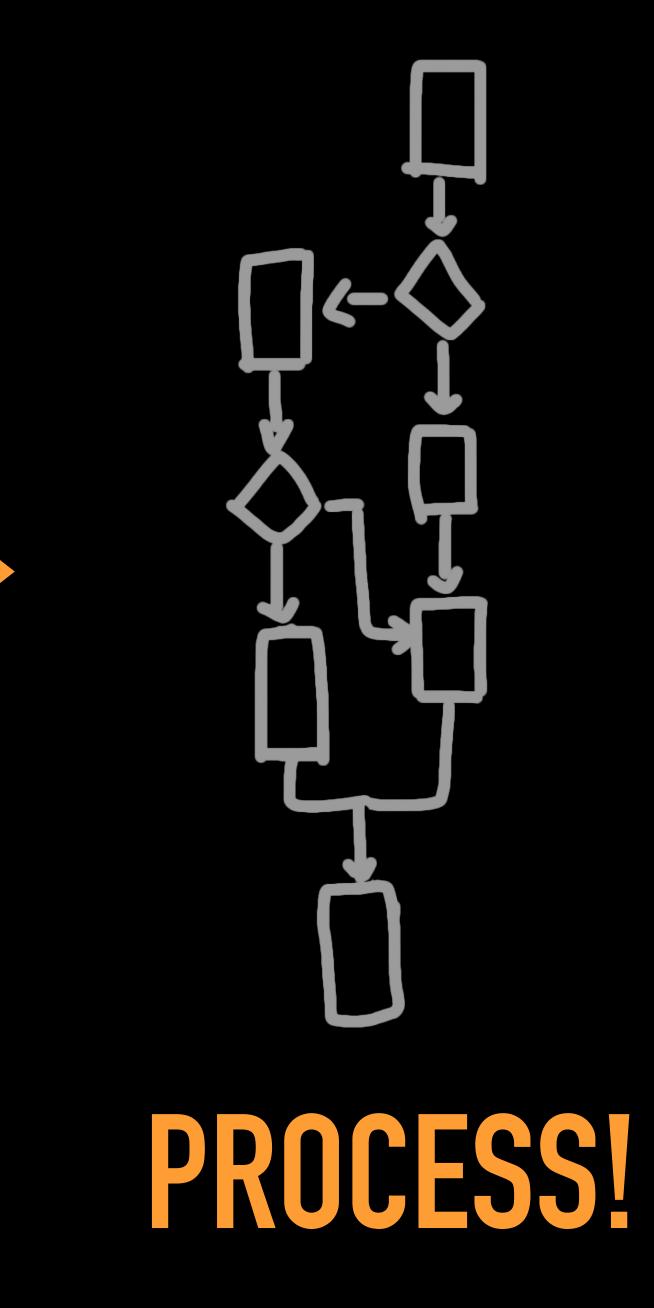








a matter of how you put them together



#### Obs 1. Cooking is a very important activity in our lives

Obs 2. We have hundreds of recipes naturally crowdsourced processes for a single dish



#### Obs 1. Cooking is a ve

#### Obs 2. We have hui for a single dish

**Can we** understand the collective knowledge and practices around cooking? How?

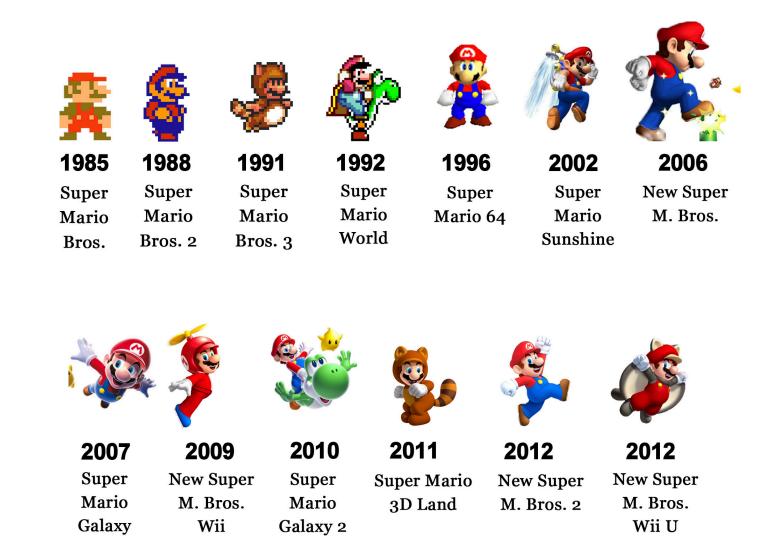
# RECIPE = PROCESS

#### **brocesses**



#### "Longitudinal"

#### how individual entities evolve, influence with time



# **Cultural analytics**

#### "Cross-sectional"

#### what's the current state of the world







# **Cultural analytics**

#### "Cross-sectional"

#### what's the current state of the world



## What can we learn from analyzing the embedded processes in hundreds of recipes for a single dish?









What are some common skills?





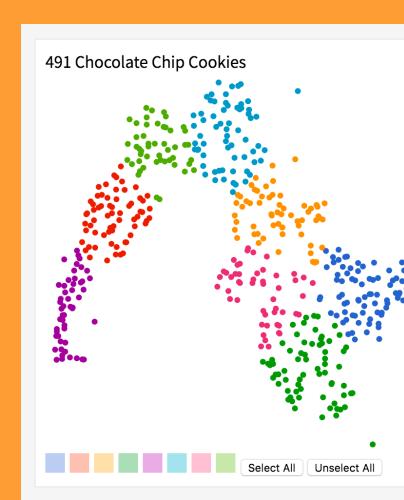
ways of making a cookie?

- What makes a cookie a cookie?
- Average recipe? Creative variants or outliers?
- Simplest vs most complex recipe?

- Can we discover ordering constraints?
- Can we cluster fundamentally different

# **RecipeScape: Recipe Analytics Interface**

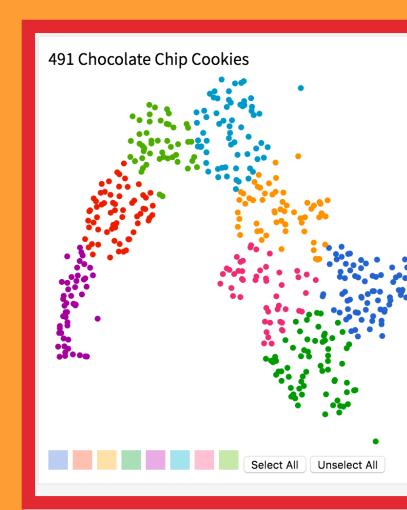
- 2 Main visualizations
- RecipeMap
- RecipeDeck

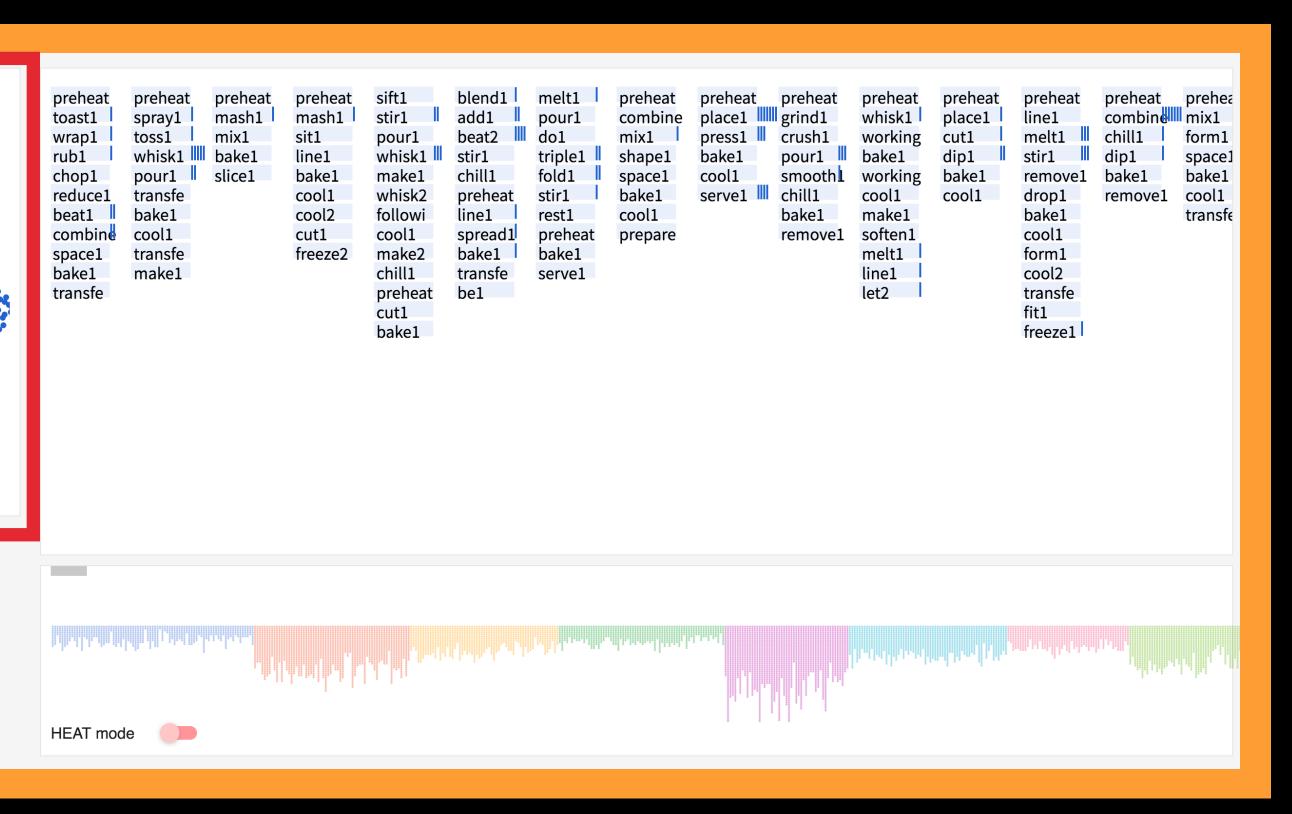




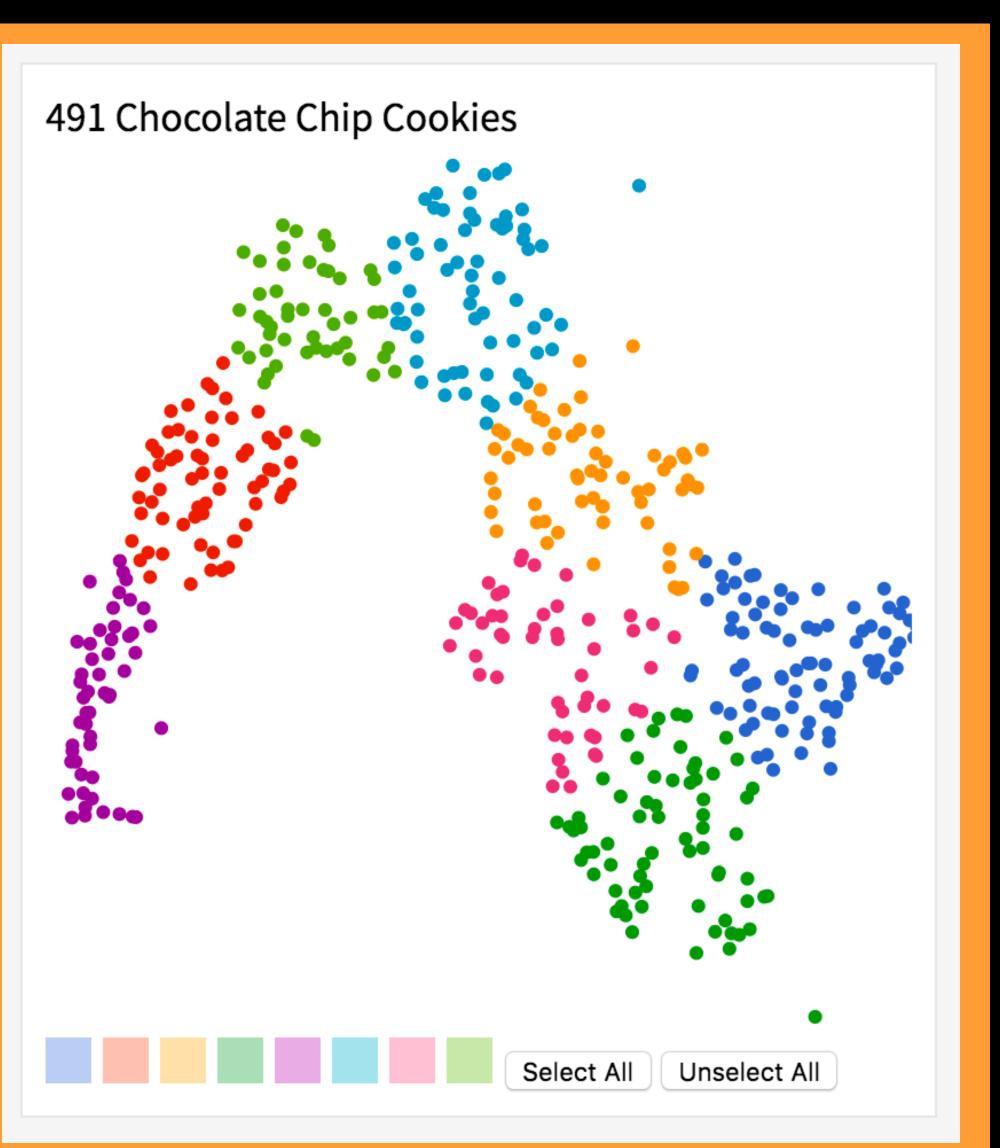
# **RecipeScape: Recipe Analytics Interface**

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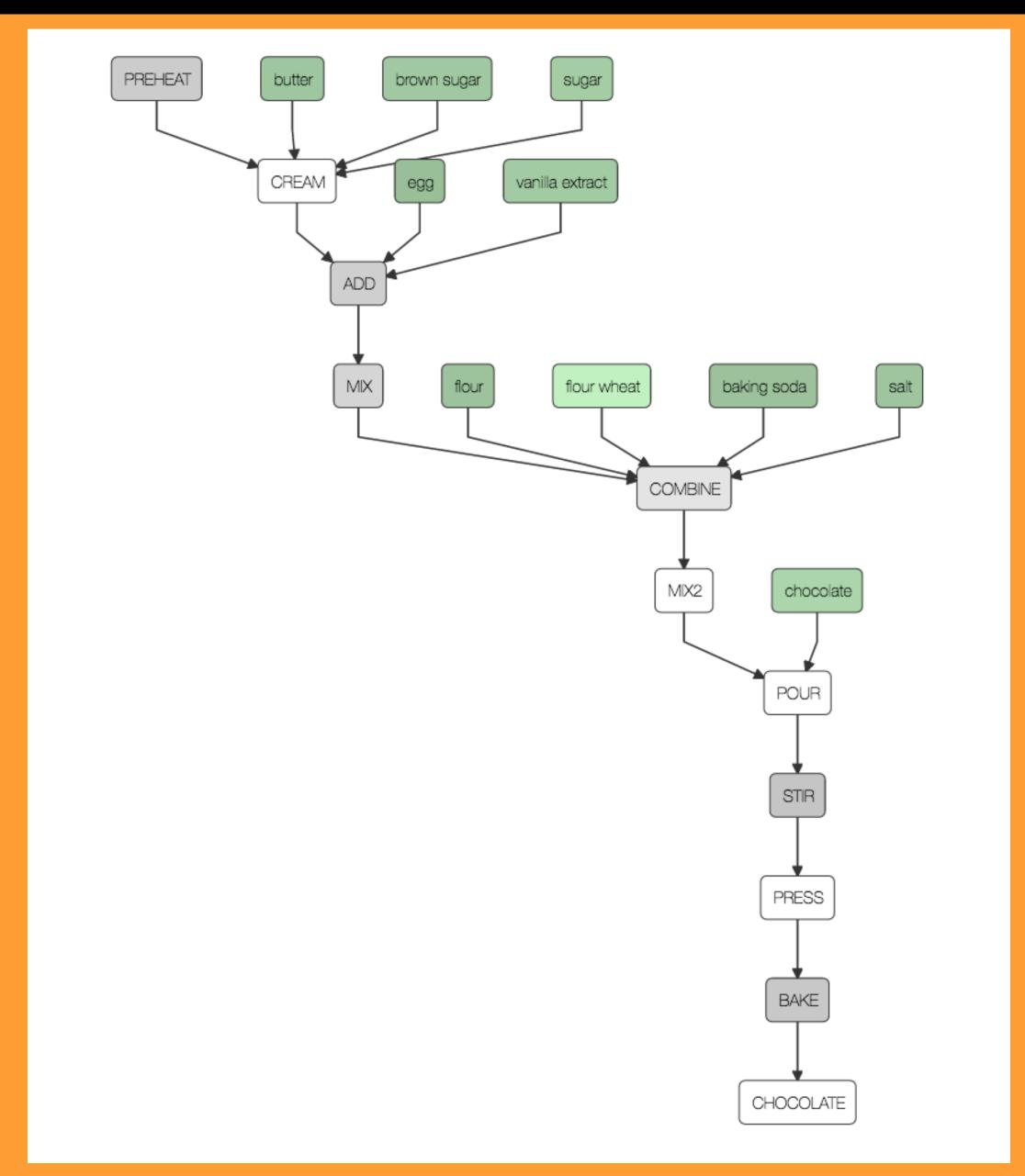




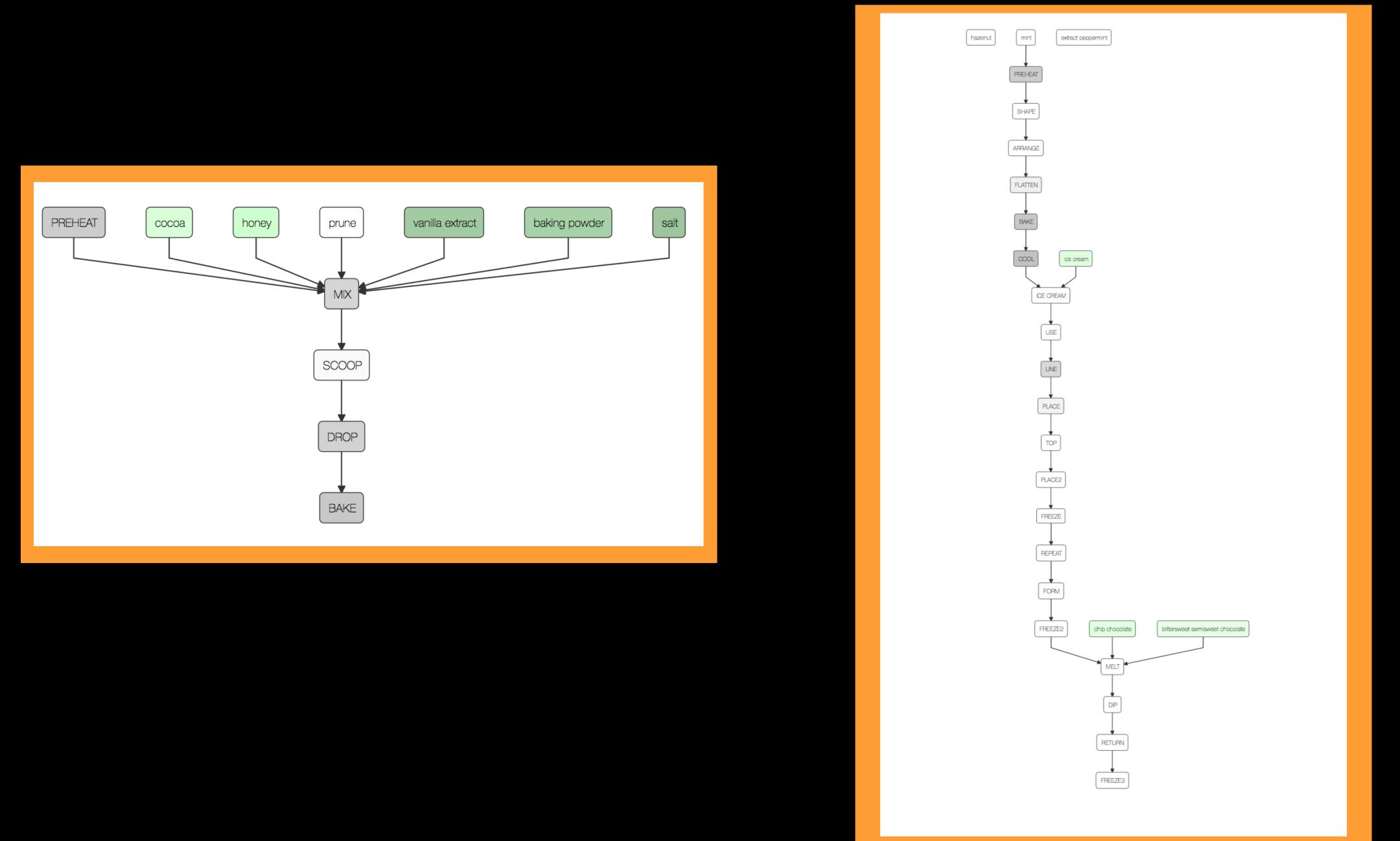
# RecipeMap



### The Median Chocolate Chip Cookie Recipe



### Far Away from the Median Recipe



# **RecipeScape: Recipe Analytics Interface**

- 2 Main visualizations
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### pairwise comparison view - union graph

#### High similarity

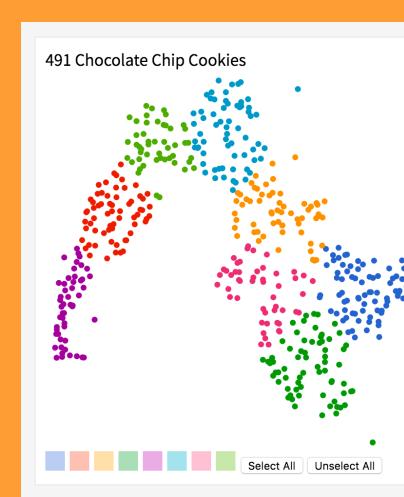
| Chocolate Chip Oatmeal vs.                           | Coconut Chocolate Chip  |
|--|---|
| Cookies  | Cookies   |
| 1. Preparation PREHEAT oven to 350F                  | 1. Preparation PREHEAT oven to 375F   |
| 2. In a bowl WHISK together flour, baking            | 2. In a bowl WHISK together flour, baking   |
| soda, baking powder, salt, and oats                  | soda, and salt  |
| 3. In another bowl with an electric mixer            | 3. In another bowl with an electric mixer   |
| CREAM butter and sugars until light and              | CREAM butter and sugars until light and   |
| fluffy   | fluffy  |
| 4. BEAT in eggs, 1 at a time, beating well           | 4. BEAT in eggs, 1 at a time, beating well  |
| after each addition, and BEAT in vanilla             | after each addition and BEAT in flour mixture   |
| 5. BEAT in eggs, 1 at a time, beating well           | 5. BEAT in eggs, 1 at a time, beating well  |
| after each addition, and BEAT in vanilla             | after each addition and BEAT in flour mixture   |
| 6. BEAT in flour mixture and stir in chocolate chips | 6. BEAT in vanilla and stir in coconut and chocolate chips                            |
| 7. Beat in flour mixture and STIR in chocolate       | 7. Beat in vanilla and STIR in coconut and  |
| chips  | chocolate chips   |
| 8. DROP dough by rounded tablespoons 2               | 8. DROP dough by level tablespoons 2  |
| inches apart onto buttered baking sheets             | inches apart onto buttered baking sheets  |
| and bake cookies in batches in middle of             | and bake cookies in middle of oven 10   |
| oven 12 to 15 minutes, or until golden               | minutes, or until golden  |
| 9. Drop dough by rounded tablespoons 2               | 9. Drop dough by level tablespoons 2 inches   |
| inches apart onto buttered baking sheets             | apart onto buttered baking sheets and BAKE  |
| and BAKE cookies in batches in middle of             | cookies in middle of oven 10 minutes, or until  |
| oven 12 to 15 minutes, or until golden               | golden  |
| 10. COOL cookies on racks                            | 10. COOL cookies on baking sheet 1 minute<br>and transfer to racks to COOL completely |
| 11. Cookies KEEP in airtight containers 5            | 11. Cool cookies on baking sheet 1 minute   |
| days   | and TRANSFER to racks to cool completely  |
|  | 12. COOL cookies on baking sheet 1 minute<br>and transfer to racks to COOL completely |
|  | 13. Cookies KEEP in airtight containers 5<br>days                                     |

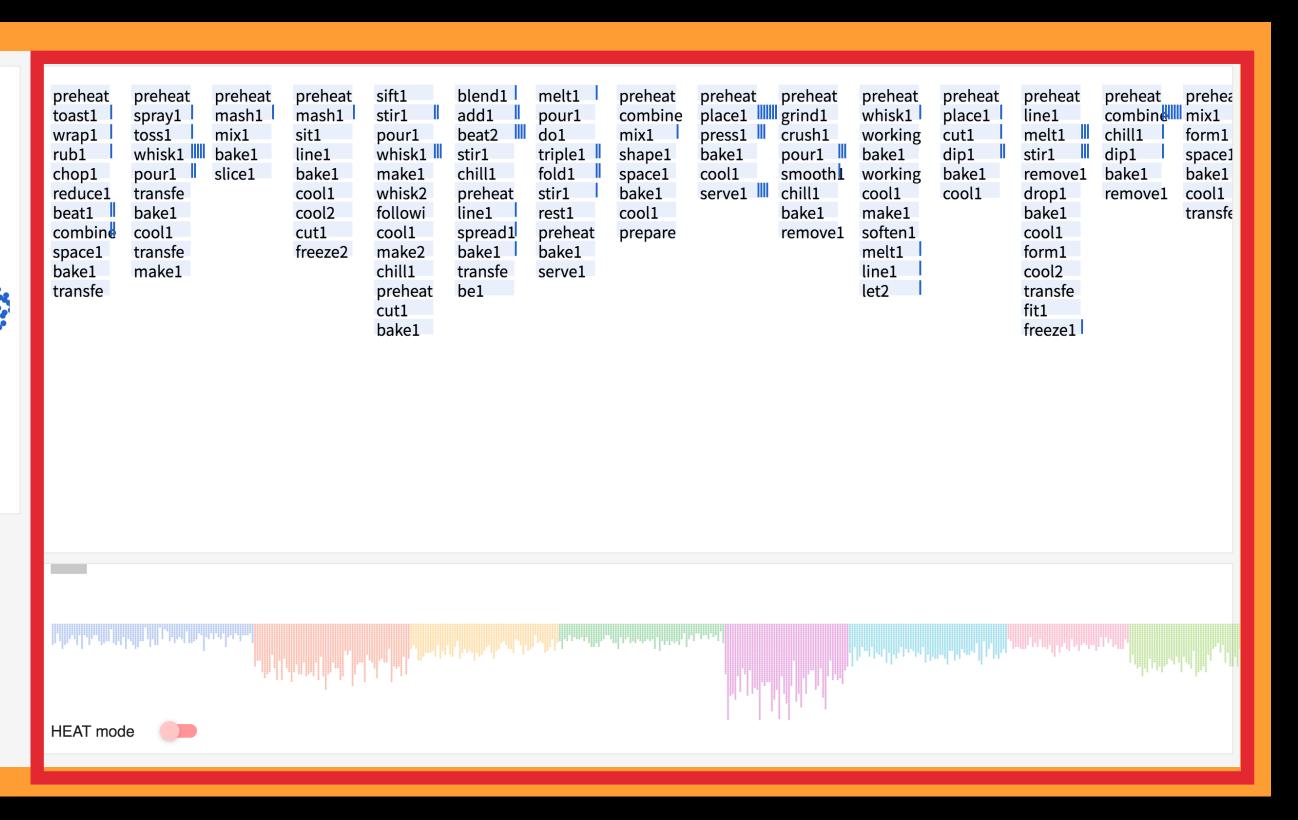
#### **Medium similarity**

| Tiny Chocolate Chip Cookies  | VS | 5. Double-Peanut Double-<br>Chocolate Chip Cookies   |
|--|----|--|
| 1. Preparation PREHEAT oven to 400F  |    | 1. Preparation PREHEAT oven to 350F  |
| <ol> <li>2. BEAT together butter, sugar, salt, and<br/>baking soda in a large bowl with an electric<br/>mixer until fluffy, then BEAT in egg and<br/>vanilla</li> <li>3. BEAT together butter, sugar, salt, and</li> </ol> |    | <ol> <li>In a bowl WHISK together flour, cocoa<br/>powder, baking soda, and baking powder</li> <li>In another bowl with an electric mixer</li> </ol> |
| <ul> <li>4. ADD flour and mix at low speed until just combined</li> </ul>  |    | 4. BEAT in eggs, 1 at a time, beating well<br>after each addition  |
| 5. FOLD in chocolate chips   |    | 5. BEAT in flour mixture and stir in chocolate<br>chips and peanut-butter chips  |
| 6. DROP barely rounded 1/2 teaspoons of<br>dough about 1 1/2 inches apart onto<br>ungreased baking sheets and bake in<br>batches in middle of oven until golden  |    | 6. Beat in flour mixture and STIR in chocolate<br>chips and peanut-butter chips  |
| 7. Drop barely rounded 1/2 teaspoons of<br>dough about 1 1/2 inches apart onto<br>ungreased baking sheets and BAKE in<br>batches in middle of oven until golden  |    | 7. DROP dough by level tablespoons 2<br>inches apart onto buttered baking sheets<br>and bake cookies in batches in middle of<br>oven 10 minutes      |
| 8. TRANSFER cookies as baked to a rack to cool   |    | 8. Drop dough by level tablespoons 2 inches<br>apart onto buttered baking sheets and BAKE<br>cookies in batches in middle of oven 10<br>minutes      |
| 9. Transfer cookies as baked to a rack to<br>COOL  |    | 9. COOL cookies on racks 10. Cookies KEEP in airtight containers 5   |
|  |    | days   |

# **RecipeScape: Recipe Analytics Interface**

- 2 Main visualizations
- RecipeMap
- RecipeDeck





### RecipeDeck: looking at all the recipes at once

| eat1 split1<br>it1 a split1<br>make1<br>expose<br>serve1<br>include<br>chop1<br>t1<br>read1<br>main1 | 1 be3<br>remain1 | combine<br>season1<br>arrange<br>spread1<br>roll1<br>cut1 | combine<br>blend1<br>be1<br>pour1<br>store1 | line1<br>melt1<br>pour1<br>scatter<br>sprinkl<br>chill1<br>peel1<br>cut1<br>serve1 | preheat<br>coat1<br>line1<br>whisk1<br>beat1<br>beat3<br>blend2<br>blend3<br>fold1<br>divide1<br>bake1<br>bake1<br>transfe<br>cool1<br>beat5<br>spread1<br>remain1<br>cover1<br>garnish<br>do1<br>cover2<br>serve1 |
|--|------------------|---|---|--|--|
|  |                  |   |   |  |  |

| spray1<br>blend1<br>press1<br>chill1<br>preheat<br>bake1<br>combine<br>dissolv<br>whisk2<br>stir1<br>remove1<br>melt1<br>spread1<br>press2<br>peel1<br>cover1<br>beat1<br>remain1<br>chill2 | preheat<br>pan1<br>dust1<br>sift1<br>beat1<br>beat2<br>beat2<br>beat3<br>fold1<br>fold1<br>transfe<br>bake1<br>cool1<br>cool2<br>sink1<br>cool2<br>sink1<br>combine<br>whisk1<br>spoon1<br>do1<br>cover1 | spray1<br>blend1<br>add1<br>come1<br>press1<br>chill1<br>preheat<br>place1<br>bake1<br>bake1<br>dissolv<br>whisk2<br>cool2<br>chop1<br>dissolv<br>whisk2<br>cool2<br>chop1<br>bake1<br>brush1<br>freeze1<br>brush1<br>brush1<br>freeze1<br>bake1 | preheat<br>line1<br>sift1<br>blend1<br>stir1<br>turn1<br>gather1<br>divide1<br>roll1<br>transfe<br>flatten<br>whisk1<br>brush1<br>bake1<br>bake1<br>cool1<br>reduce1<br>transfe<br>crosswi<br>cut2<br>bake1<br>transfe<br>stir2 | combine<br>stir1<br>increas<br>remove1<br>make1<br>cover1<br>use1<br>preheat<br>line1<br>sift1<br>blend1<br>blend1<br>beat2<br>stir2<br>drop1<br>bake1<br>cool1<br>bake1<br>cool1<br>peel1<br>spread1<br>top1<br>cover2<br>cover3 | preheat<br>line1<br>sift1<br>stir1<br>set1<br>beat1<br>beat2<br>be1<br>beat3<br>divide1<br>bake1<br>cool1<br>turn1<br>cool2<br>be5<br>wrap1<br>be6<br>cut2<br>spread1<br>frost1<br>top1<br>spread2 | preheat<br>line1<br>combine<br>stir1<br>iremove1<br>whisk1<br>add1<br>use1<br>beat1<br>beat1<br>stir2<br>space1<br>bake1<br>cool1<br>cool2<br>make1 | preheat<br>cut1<br>space1<br>press1<br>bake1<br>transfe<br>line1<br>top1<br>top2<br>compact<br>remain1<br>freeze1<br>use3<br>freeze2<br>stir1<br>stand1<br>use4<br>dip1<br>return1<br>remain2<br>freeze3<br>do1 |
|---|--|--|---|---|--|---|---|
|   |  | -  |   |   |  |   |   |
|   |  | cool3  | stir2   | cover3  |  |   |   |
|   |  | reserve  | remove1   | be4   | sprinkl  |   | wrap1   |
|   |  | make1  | set1  | cut1  | chill1   |   |   |

### RecipeDeck: heat mode

| Pat1<br>It1<br>It2<br>Iat1<br>Iol1<br>Immer1<br>It1<br>Iread1<br>main1 | split1<br>make1<br>expose1<br>serve1<br>include<br>chop1 | place1<br>scald1<br>be3<br>remain1<br>set1<br>serve1 | combine<br>blend1<br>be1<br>pour1<br>store1 | line1<br>melt1<br>pour1<br>scatter<br>sprinkl<br>chill1<br>peel1<br>cut1<br>serve1 | preheat<br>coat1<br>line1<br>whisk1<br>beat1<br>beat1<br>beat3<br>blend2<br>blend3<br>blend3<br>fold1<br>divide1<br>bake1<br>transfe<br>cool1<br>beat5<br>spread1<br>remain1<br>cover1<br>garnish<br>do1<br>cover2<br>serve1 | spray1<br>blend1<br>press1<br>chill1<br>preheat<br>bake1<br>combine<br>dissolv<br>whisk2<br>stir1<br>remove1<br>melt1<br>spread1<br>press2<br>peel1<br>cover1<br>beat1<br>remain1<br>chill2 | beat1<br>beat2<br>beat3<br>end1<br>fold1<br>transfe<br>bake1<br>cool1<br>cool2<br>sink1 | spray1<br>blend1<br>add1<br>come1<br>press1<br>chill1<br>preheat<br>place1<br>bake1<br>cool1<br>dissolv<br>whisk2<br>cool2<br>chop1<br>stir1<br>brush1<br>freeze1<br>brush1<br>freeze1<br>bake1<br>cool3<br>reserve<br>make1 | preheat<br>line1<br>sift1<br>blend1<br>stir1<br>turn1<br>gather1<br>divide1<br>roll1<br>transfe<br>flatten<br>whisk1<br>brush1<br>bake1<br>bake1<br>cool1<br>reduce1<br>transfe<br>crosswi<br>cut2<br>bake1<br>transfe<br>stir2<br>remove1<br>set1 | combine<br>stir1<br>increas<br>remove1<br>make1<br>cover1<br>use1<br>preheat<br>line1<br>blend1<br>blend1<br>blend1<br>blend1<br>drop1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1<br>bake1<br>cool1 | preheat<br>line1<br>sift1<br>stir1<br>set1<br>beat1<br>beat2<br>beat2<br>be1<br>beat3<br>divide1<br>bake1<br>bake1<br>cool1<br>bake1<br>cool2<br>be5<br>wrap1<br>be5<br>wrap1<br>be6<br>cut2<br>be5<br>wrap1<br>be6<br>cut2<br>spread1<br>frost1<br>be6<br>cut2<br>spread1<br>frost1 | preheat<br>line1<br>combine<br>stir1<br>remove1<br>whisk1<br>add1<br>use1<br>beat1<br>beat1<br>stir2<br>space1<br>bake1<br>cool1<br>cool2<br>make1 | press1<br>bake1<br>transfe<br>line1<br>top1<br>top2<br>compact |
|--|--|--|---|--|--|---|---|--|--|--|--|--|--|
| <b>₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽₽</b>                            | mode   |  |   |  |  |   |   |  |  |  |  | ••••••<br>•••••<br>•••••<br>••••••<br>•••••<br>••••••<br>••••  |  |

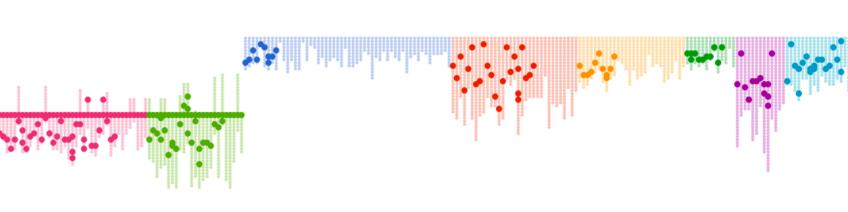


### **RecipeDeck: select individual action**

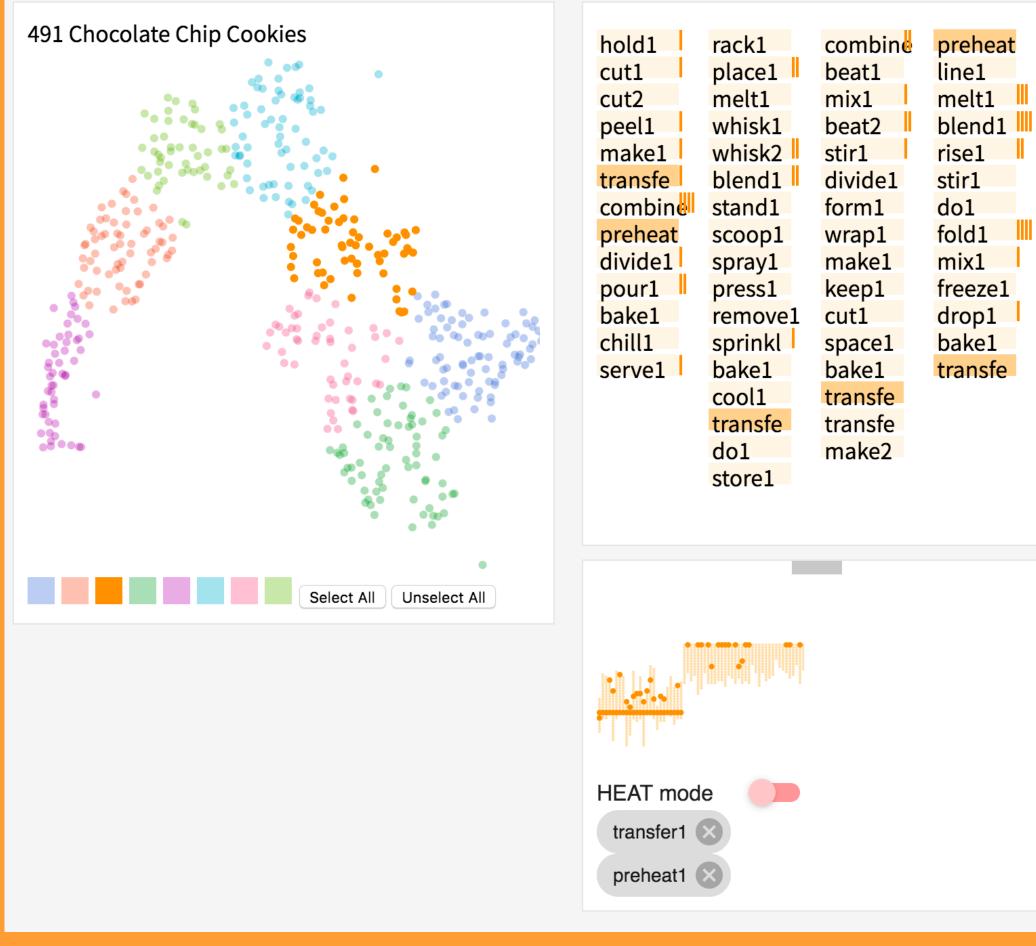
| preheat<br>toast1<br>wrap1<br>rub1<br>chop1<br>reduce1<br>beat1<br>bake1<br>transfe | spray1<br>toss1<br>whisk1 | preheat<br>mash1<br>mix1<br>bake1<br>slice1 | preheat<br>mash1<br>sit1<br>line1<br>bake1<br>cool1<br>ared baking<br>cut1<br>freeze2 | sift1<br>stir1<br>pour1<br>whisk1<br>make1<br>whisk2<br>sheet.<br>cool1<br>make2<br>chill1<br>preheat<br>cut1<br>bake1 | blend1<br>add1<br>beat2<br>stir1<br>chill1<br>preheat<br>ine1<br>spread1<br>bake1<br>transfe<br>be1 | melt1<br>pour1<br>do1<br>triple1<br>fold1<br>stir1<br>rest1<br>preheat<br>bake1<br>serve1 | preheat<br>combine<br>mix1<br>shape1<br>space1<br>bake1<br>cool1<br>prepare | preheat<br>place1<br>bake1<br>cool1<br>serve1 | preheat<br>grind1<br>crush1<br>pour1<br>smooth1<br>chill1<br>bake1<br>remove1 | preheat<br>whisk1<br>working<br>bake1<br>working<br>cool1<br>make1<br>soften1<br>line1<br>let2 | preheat<br>place1<br>cut1<br>dip1<br>bake1<br>cool1 | preheat<br>line1<br>melt1<br>stir1<br>remove1<br>drop1<br>bake1<br>cool1<br>form1<br>cool2<br>transfe<br>fit1<br>freeze1 | preheat<br>combine<br>chill1<br>dip1<br>bake1<br>remove1 | prehea<br>mix1<br>form1<br>space1<br>bake1<br>cool1<br>transfe |
|---|---------------------------|---|---|--|---|---|---|---|---|--|---|--|--|--|
| HEAT mod<br>preheat1  |                           |   |   |  |   |   |   |   |   |  |   |  |  |  |

### RecipeDeck: select more than one action

| preheat<br>combine<br>set1<br>granula<br>blend1<br>add2<br>beat1<br>place1<br>arrange<br>press1<br>continu<br>brown1<br>lift1<br>let1<br>wax1<br>melt1<br>wax1<br>melt2<br>coat1<br>press2 | preheat<br>knock1<br>whisk1<br>melt1<br>cool1<br>be1<br>combine<br>spread1<br>cool2<br>turn1<br>remove1<br>stir3<br>cool3<br>spoon1<br>squeeze<br>squeeze<br>chill1<br>bring2 | hold1<br>cut2<br>peel1<br>make1<br>transfe<br>combine<br>preheat<br>divide1<br>pour1<br>bake1<br>chill1<br>serve1 | preheat<br>stir1<br>sift1<br>beat1<br>beat2<br>blend1<br>spread1<br>sprinkl<br>remain1<br>bake1<br>cool1 | preheat<br>line1<br>melt1<br>blend1<br>rise1<br>stir1<br>do1<br>fold1<br>mix1<br>freeze1<br>drop1<br>bake1<br>transfe | preheat<br>line1<br>sift1<br>beat1<br>beat2<br>beat3<br>fold1<br>drop1<br>flatten<br>bake1<br>reverse<br>bake1<br>cool1<br>freeze1<br>spoon1<br>top1<br>wrap1<br>remain1<br>do1 | preheat<br>line1<br>scrape1<br>beat1<br>marshma<br>fold1<br>drop1<br>bake1<br>transfe<br>transfe<br>simmer1<br>stir1<br>dip1<br>chocola<br>remain1<br>chill1<br>make1<br>cover1<br>serve1 | preheat<br>blend1<br>drop1<br>press1<br>bake1<br>touch1<br>cool1<br>be1<br>simmer1<br>reduce1<br>be2<br>remove1<br>spread1<br>remain1<br>prepare<br>cover1<br>serve1 | preheat<br>butter1<br>line1<br>blend1<br>sift1<br>spread1<br>bake1<br>dissolv<br>whisk1<br>read1<br>remove1<br>pour1<br>run1<br>cut1<br>chill1 | sift1<br>set1<br>beat1<br>beat2<br>squeeze<br>form1<br>roll1<br>chill1<br>preheat<br>line1<br>remove1<br>lay1<br>bake1<br>cool1<br>can1 | preheat<br>melt1<br>cool1<br>beat1<br>beat2<br>resembl<br>whisk1<br>beat4<br>stir1<br>place1<br>roll1<br>space1<br>bake1<br>cool2<br>transfe | preheat<br>combine<br>stir1<br>remove1<br>whisk1<br>combine<br>cool1<br>whisk3<br>whisk4<br>pour1<br>bake1<br>cool2<br>cut1<br>be1 | preheat<br>combine<br>use1<br>chop1<br>transfe<br>divide1<br>roll1<br>cut2<br>transfe<br>gather1<br>remain1<br>re1<br>sprinkl<br>bake1<br>cool1<br>transfe<br>be1 | preheat<br>bake1<br>transfe<br>increas<br>bake1<br>whisk1<br>pour1<br>spread1<br>bake3<br>bake4<br>cool1 | sift1<br>beat<br>beat<br>beat<br>stir1<br>cove<br>be1<br>keep<br>softe<br>pref<br>line:<br>roll1<br>arra<br>bake<br>let1<br>tran<br>mak<br>wax |
|--|---|---|--|---|---|---|--|--|---|--|--|---|--|--|
| HEAT mode<br>preheat1  |   |   |  |   |   |   |  |  |   |  |  |   |  |  |



### **RecipeScape : within clusters**



| preheat     | whisk1  | preheat  | coat1   | preheat | preheat          | sift1   | preheat | stir1   | preheat | prehea  |
|-------------|---------|----------|---------|---------|------------------|---------|---------|---------|---------|---------|
| line1       | beat1   | melt1    | cook1   | combine | bake1            | beat1   | dissolv | combine | grind1  | line1   |
| <br>scrape1 | combine | cool1    | cool1   | use1    | transfe          | beat2   | blend1  | beat1   | set1    | stir1   |
| beat1       | blend1  | beat1    | whisk1  |         | -                | beat3   |         | beat2   | stir1   | whisk1  |
|             |         |          |         | chop1   | increas<br>bake1 |         | prepare |         |         |         |
| marshma     | stir1   | beat2    | form1   | transfe |                  | stir1   | press1  | combine | transfe | bake1   |
| fold1       | cover1  | resembl  | blend1  | divide1 | whisk1           | cover1  | brush1  | chill1  | cool1   | combi   |
| drop1       | make1   | whisk1   | be1     | roll1   | pour1            | be1     | bake1   | preheat | melt1   | divide  |
| bake1       | keep1   | beat4    | beat4   | cut2    | spread1          | keep1   | transfe | powder  | blend1  | bake2   |
| transfe     | continu | stir1    | fold1   | transfe | bake3            | soften1 | release | form1   | blend2  | transfe |
| transfe     | form1   | place1   | drop1   | gather1 | bake4            | preheat | cut1    | roll1   | roll1   |         |
| simmer      | space1  | roll1    | bake1   | remain1 | cool1            | line1   | cool1   | space1  | cut1    |         |
| stir1       | flatten | space1   | reverse | re1     |                  | roll1   |         | press1  | transfe |         |
| dip1        | bake1   | bake1    | cool2   | sprinkl |                  | arrange |         | bake1   | cut2    |         |
| chocola     | bake1   | cool2    | transfe | bake1   |                  | bake1   |         | transfe | brush1  |         |
| remain1     | cool1   | transfe  | tranore | cool1   |                  | let1    |         | prepare | bake1   |         |
| chill1      | transfe | ciulisic |         | transfe |                  | transfe |         | freeze1 | cool2   |         |
|             |         |          |         |         |                  |         |         | IIEEZET |         |         |
| make1       | make2   |          |         | be1     |                  | make1   |         |         | transfe |         |
| cover1      | store1  |          |         |         |                  | wax1    |         |         |         |         |
| com (01     |         |          |         |         |                  |         |         |         |         |         |



### **Computational Pipeline behind RecipeScape**

### **Recipe Text**

#### INGREDIENTS

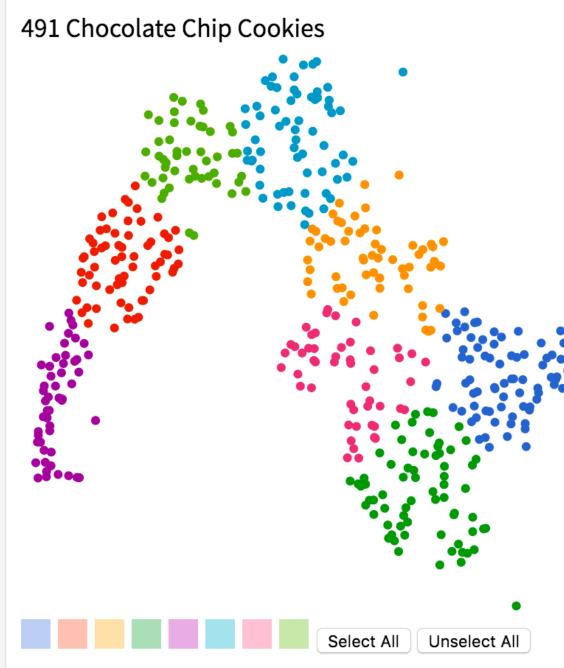
8 ounces unsalted butter (2 sticks; 225g)

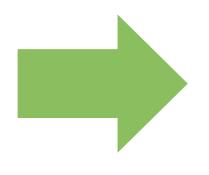
- 1 standard ice cube (about 2 tablespoons; 30mL frozen water)
- 10 ounces all-purpose flour (about 2 cups; 280g)
- 3/4 teaspoon (3g) baking soda
- 2 teaspoons Diamond Crystal kosher salt or 1 teaspoon table salt (4g)
- 5 ounces granulated sugar (about 3/4 cup; 140g)
- 2 large eggs (100g)
- 2 teaspoons (10mL) vanilla extract
- 5 ounces dark brown sugar (about 1/2 tightly packed cup plus 2 tablespoons; 140g)
- 8 ounces (225g) semisweet chocolate, roughly chopped with a knife into 1/2- to 1/4-inch chunks

#### DIRECTIONS

- 1. Melt butter in a medium saucepan over medium-high heat. Cook, gently swirling pan constantly, until particles begin to turn golden brown and butter smells nutty, about 5 minutes. Remove from heat and continue swirling the pan until the butter is a rich brown, about 15 seconds longer. Transfer to a medium bowl, whisk in ice cube, transfer to refrigerator, and allow to cool completely, about 20 minutes, whisking occasionally. (Alternatively, whisk over an ice bath to hasten the process.)
- 2. Meanwhile, whisk together flour, baking soda, and salt in a large bowl. Place granulated sugar, eggs, and vanilla extract in the bowl of a stand mixer fitted with the whisk attachment. Whisk on mediumhigh speed until mixture is pale brownish-yellow and falls off the whisk in thick ribbons when lifted, about 5 minutes.
- 3. Fit paddle attachment onto mixer. When brown butter mixture has cooled (it should be just starting to turn opaque again and firm around the edges), add brown sugar and cooled brown butter to egg mixture in stand mixer. Mix on medium speed to combine, about 15 seconds. Add flour mixture and mix on low speed until just barely combined, with some dry flour still remaining, about 15 seconds. Add chocolate and mix on low speed until dough comes together, about 15 seconds longer. Transfer to an airtight container and refrigerate dough at least overnight and up to 3 days.

#### RecipeScape







#### How to extract structural similarity measure from recipe text?

#### **Recipe Text**

#### INGREDIENTS

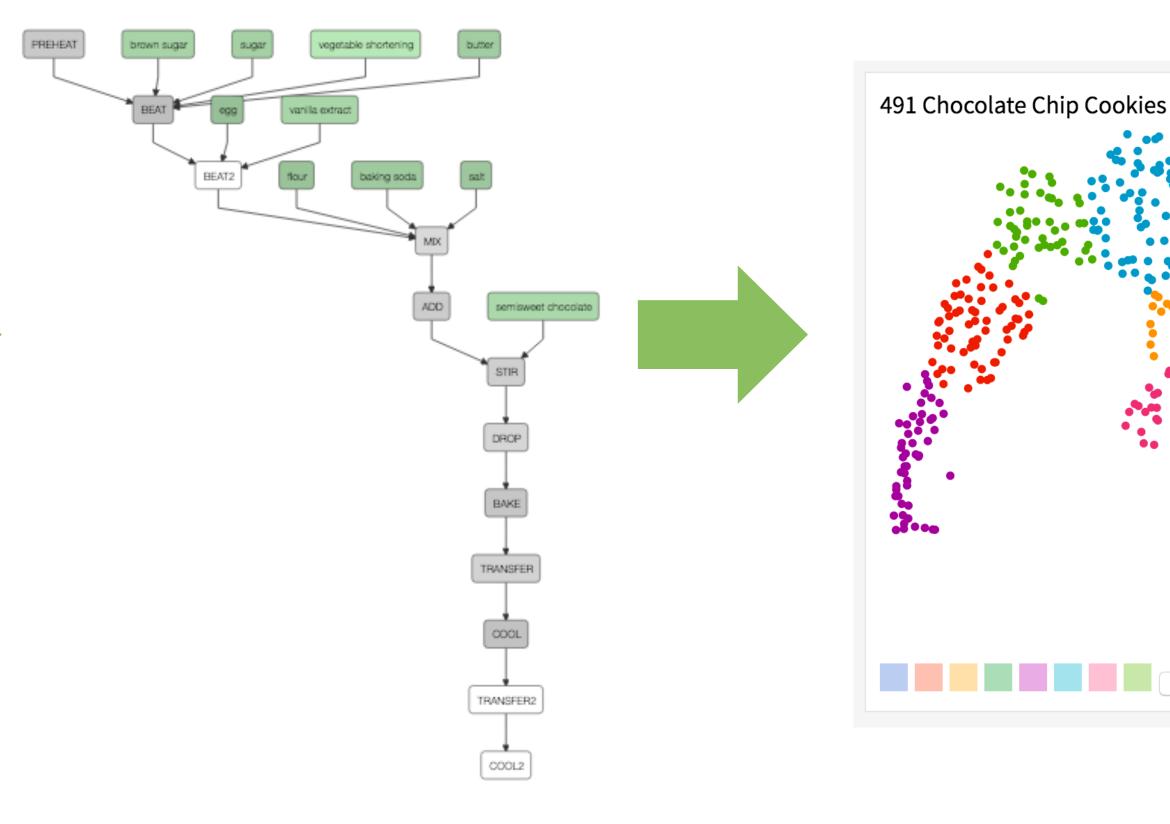
8 ounces unsalted butter (2 sticks; 225g)

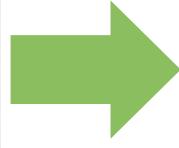
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- 10 ounces all-purpose flour (about 2 cups; 280g)
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### **Graphical Representation**





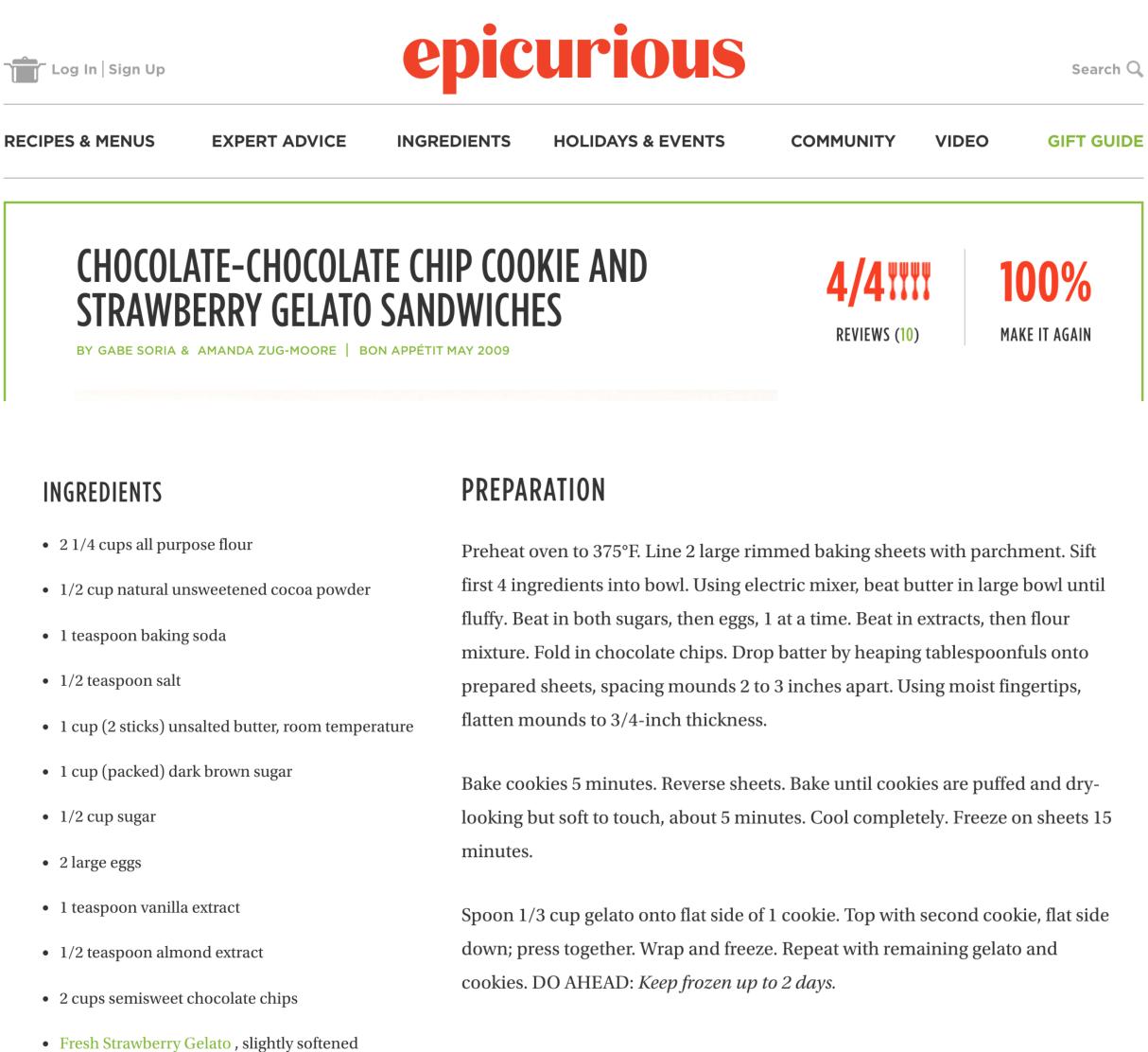
#### RecipeScape

Select All

Unselect All

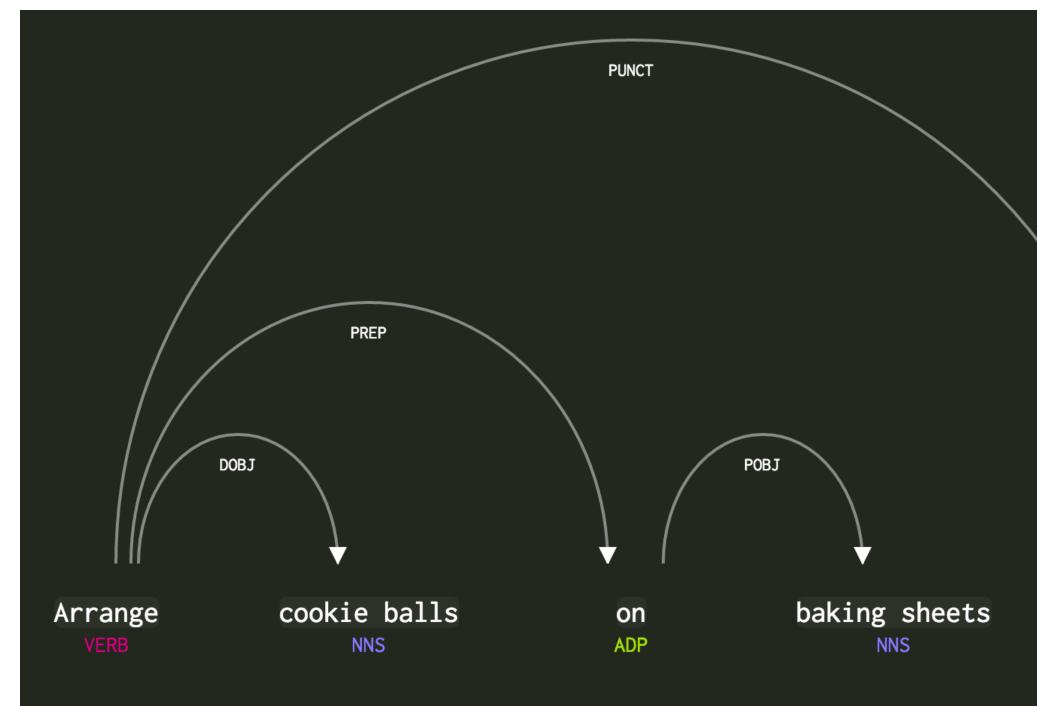


#### **Step 1: Scrape online recipes**

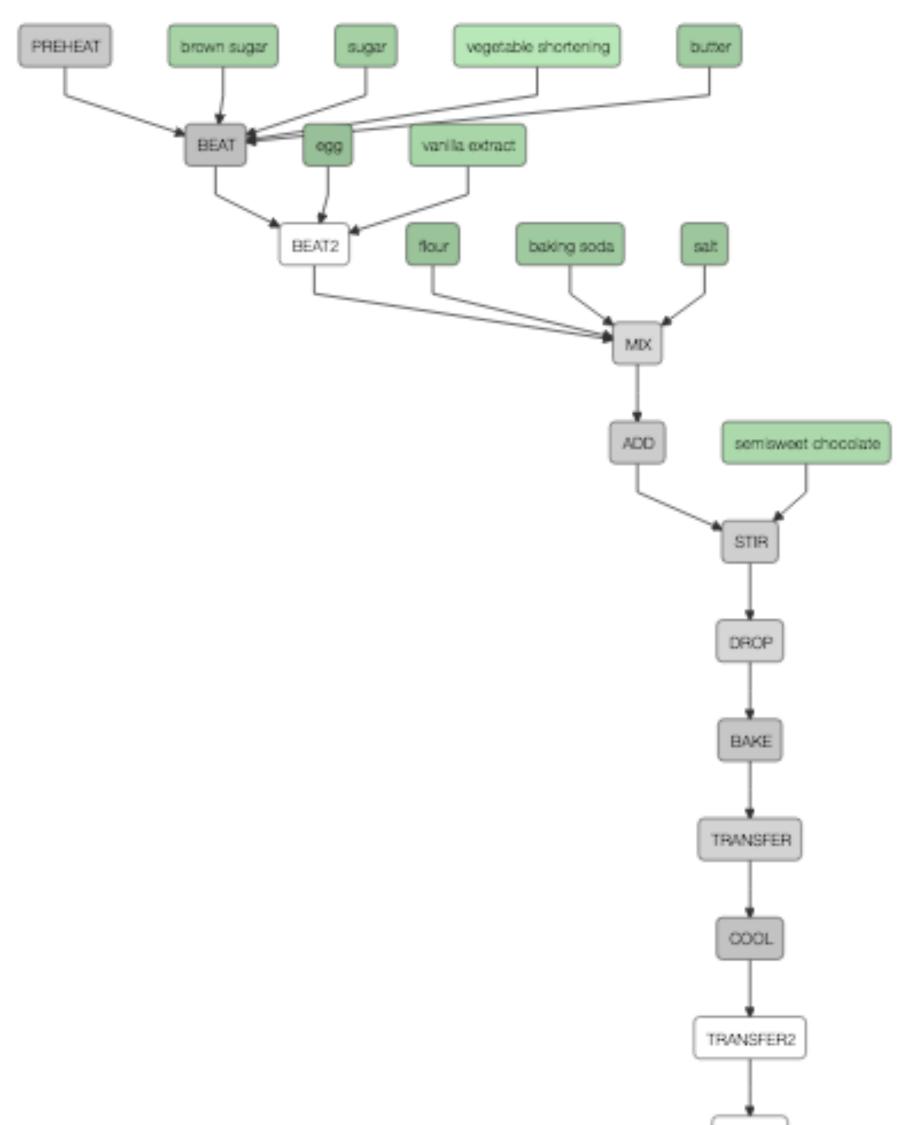




### **Step 2: Parse recipes and produce a tree**



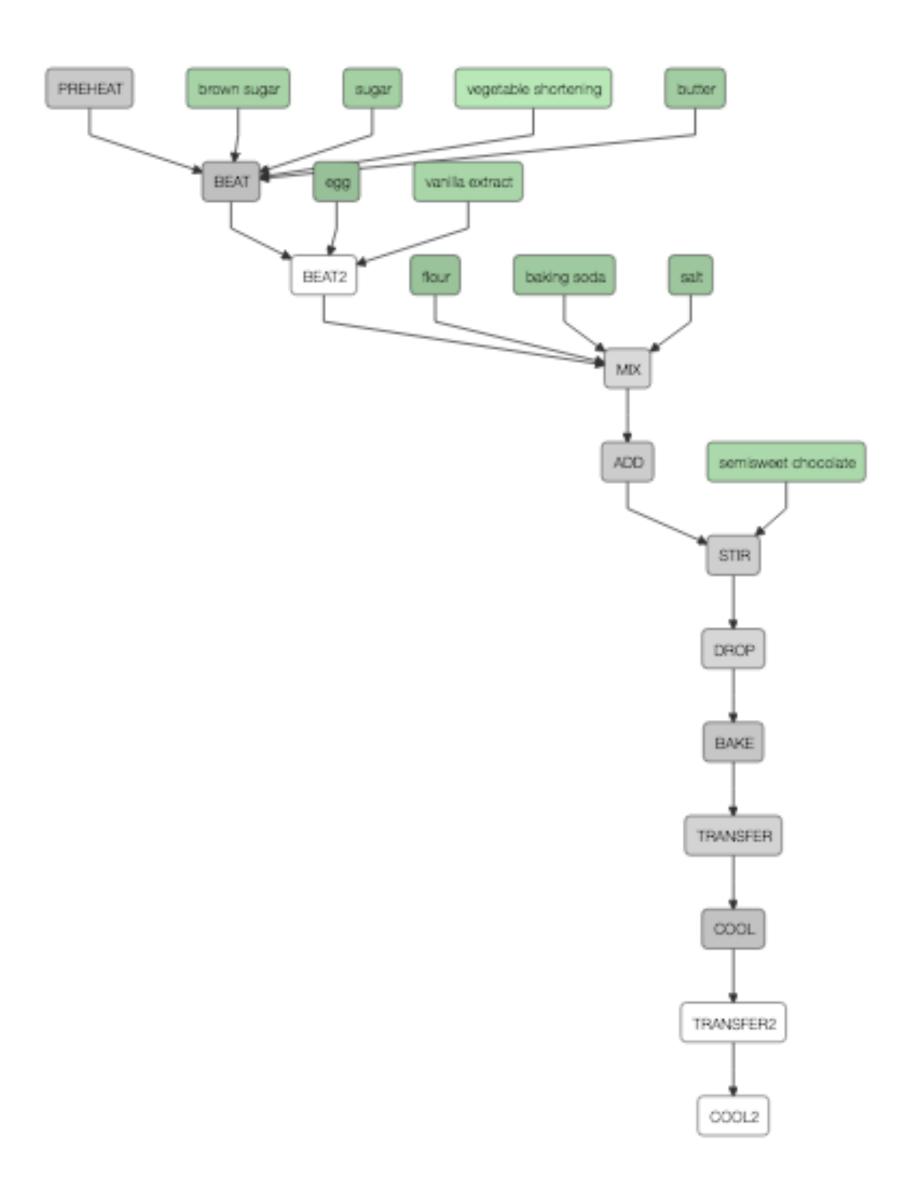


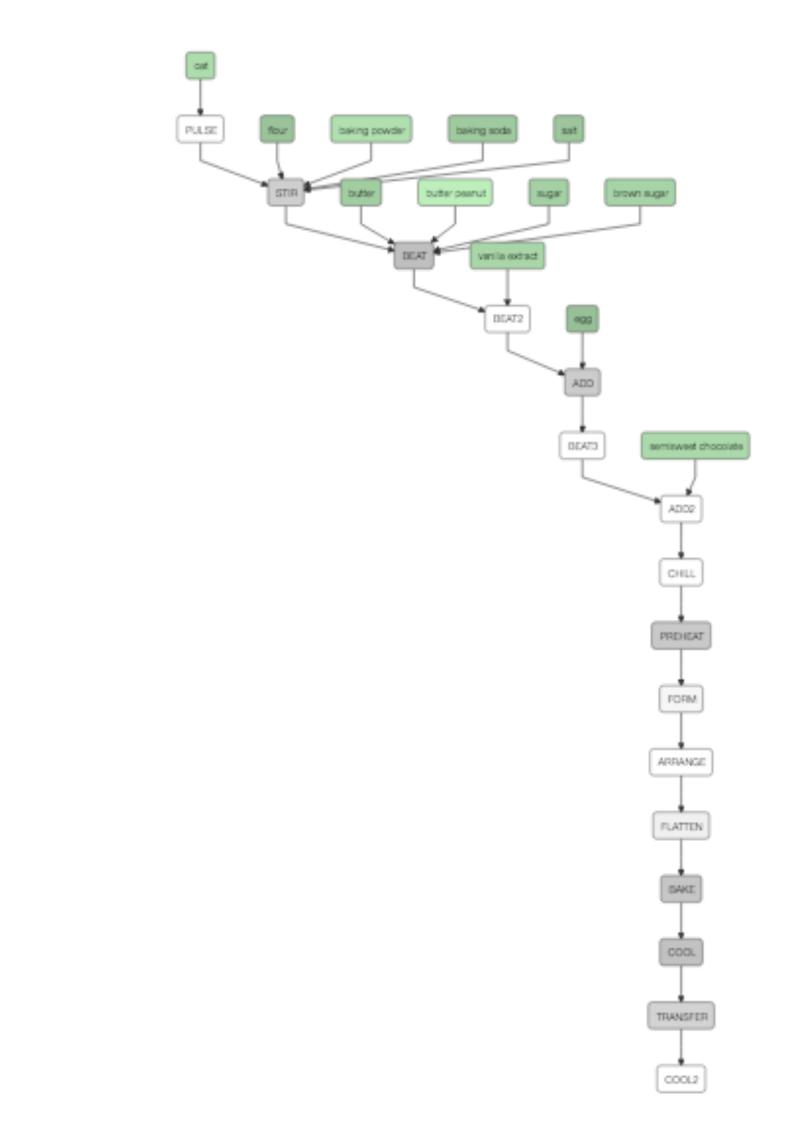


COOL2

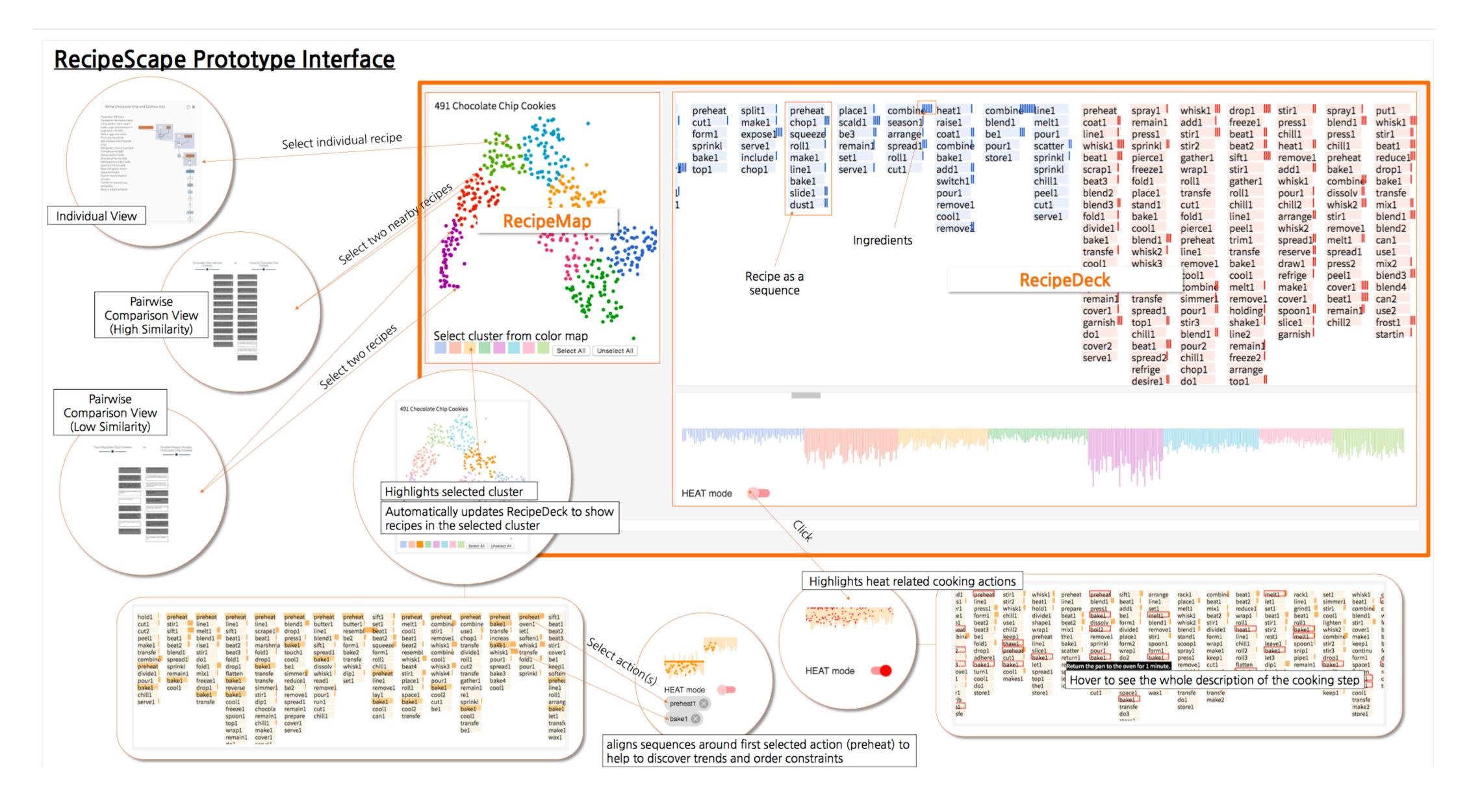
#### **Step 3: Compute similarity between recipe topologies**

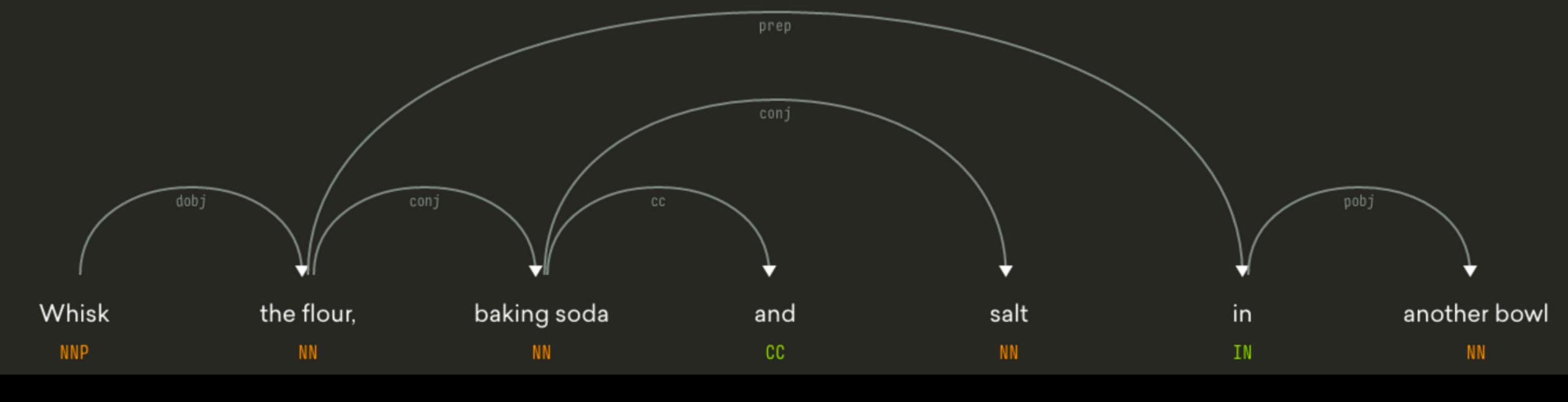
VS



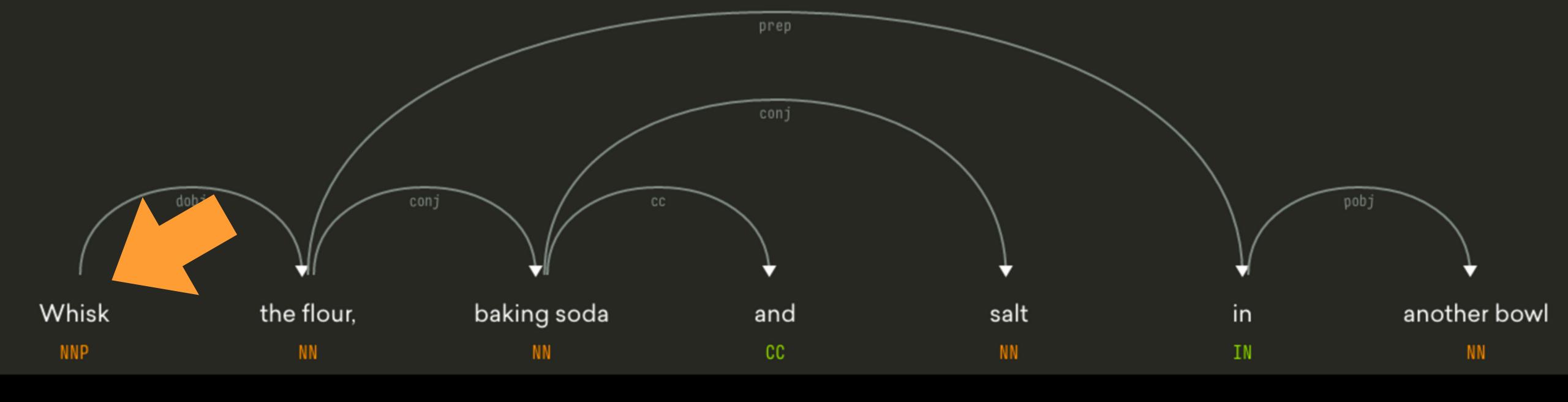


#### Step 4: Visualize & support analytics

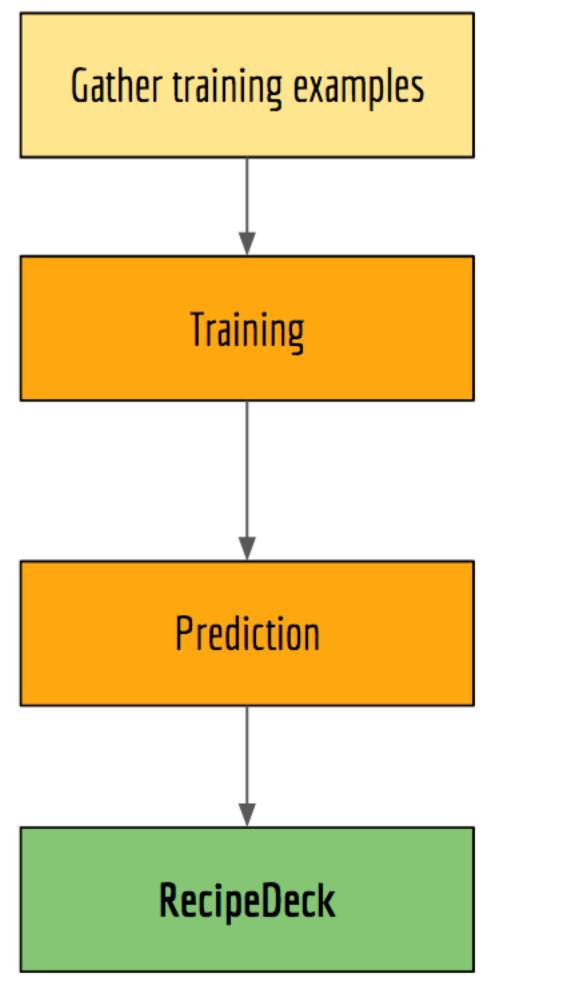




# **Problem 1:** Decomposing and detecting cooking actions from the Sentences



# **Problem 1:** Decomposing and detecting cooking actions from the Sentences



Upgraded version of NYT Cooking's Ingredient Tagger
 How do we collect labeled training examples? → crowdsourcing

2) Training: Feed labeled examples to the CRF ex) Whisk-Verb, Beat-Verb, Salt-Ingredient, etc...

3) Run CRF for unlabeled sentences to get cooking verbs

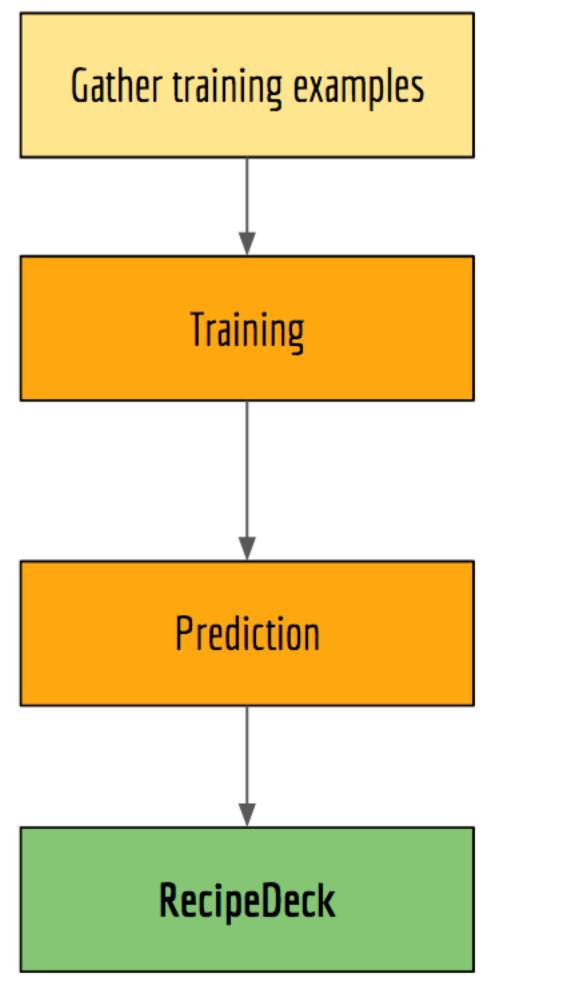
4) The cooking verbs are stacked in the order they appear

# Recipe 1 Sentence 3 GO NEX Sentence Sprinkle\_ with 1/2 cup nuts ; press nuts into dough .

#### Available Tags



NEXT SENTENCE



Upgraded version of NYT Cooking's Ingredient Tagger
 How do we collect labeled training examples? → crowdsourcing

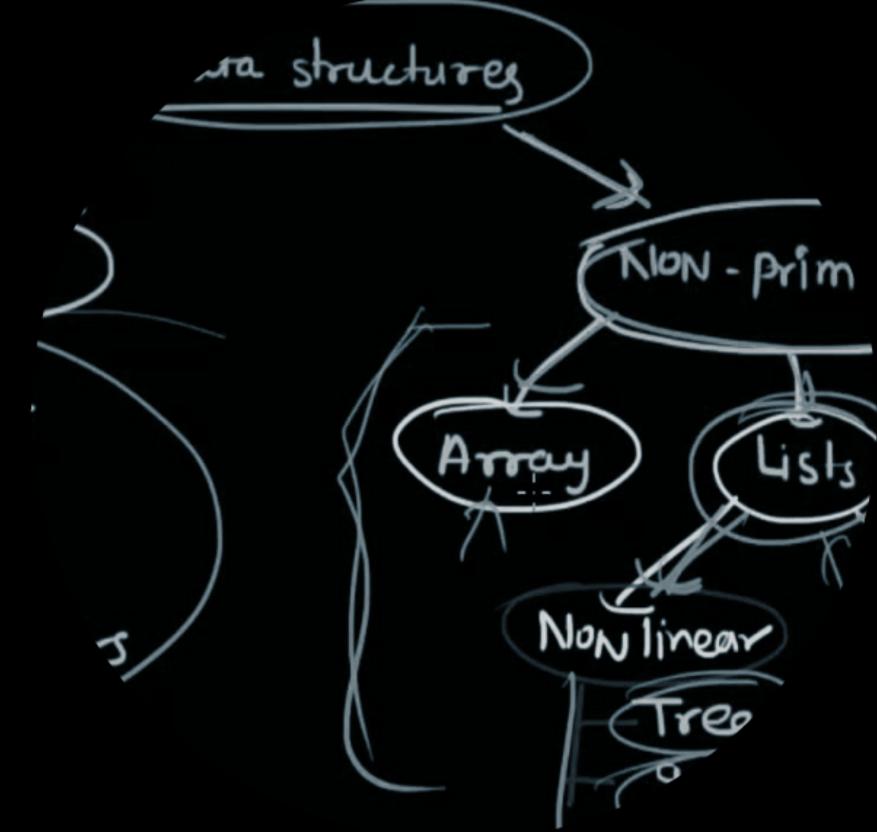
2) Training: Feed labeled examples to the CRF ex) Whisk-Verb, Beat-Verb, Salt-Ingredient, etc...

3) Run CRF for unlabeled sentences to get cooking verbs

4) The cooking verbs are stacked in the order they appear

# Problem 2: Finding the appropriate representation for recipes!





#### PREPARATION

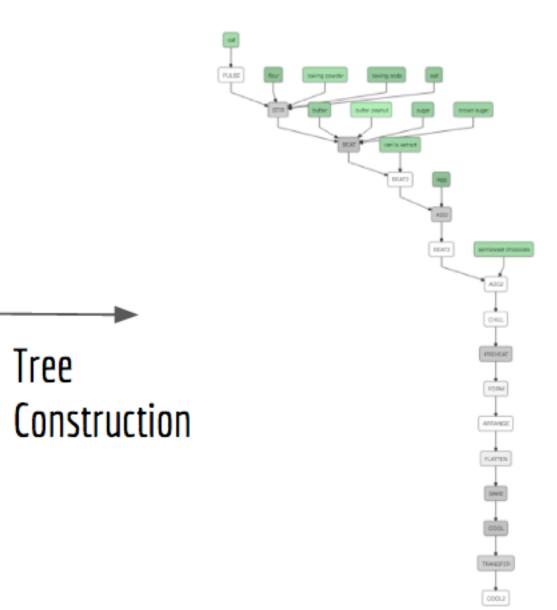
Preheat oven to 160°C (325°F). Place the butter, both the sugars, egg, vanilla, flour, baking soda and cocoa in a food processor and process until a dough forms.

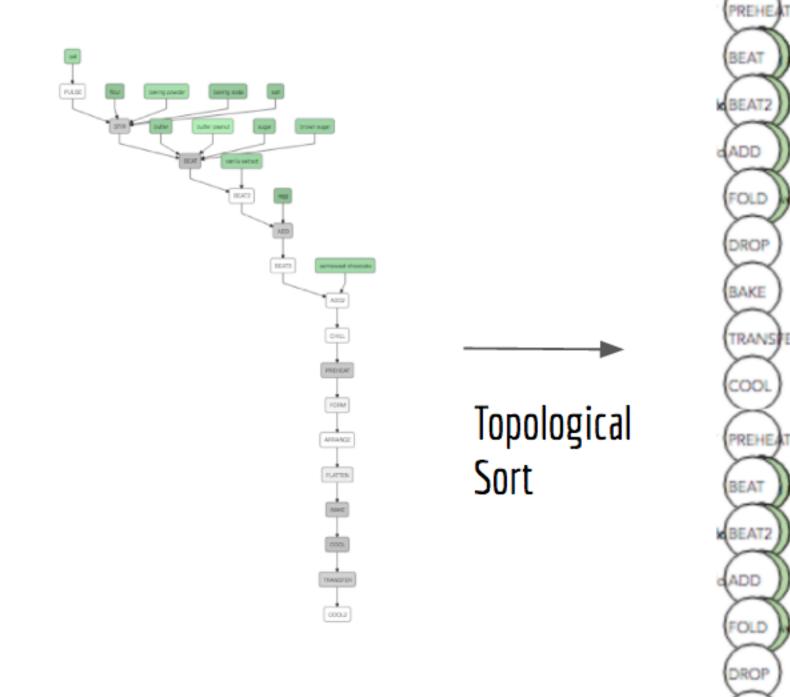
Press the dough out to a 10-inch round on a baking tray lined with non-stick baking paper, scatter with the chocolate and lightly press the pieces into the dough. Bake for 15–20 minutes or until firm to the touch. Allow to cool slightly on the tray. Serve warm with ice cream and caramel sauce.



NLP

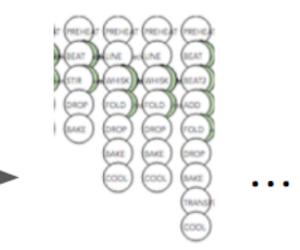
| ooking Action | Ingredient              |
|---------------|-------------------------|
| reheat        |                         |
| lace          | {Butter, sugar, egg, r} |
| rocess        |                         |
|               |                         |

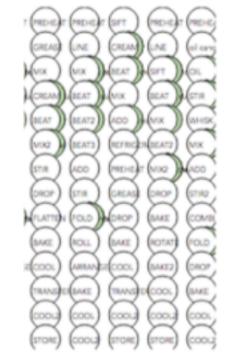


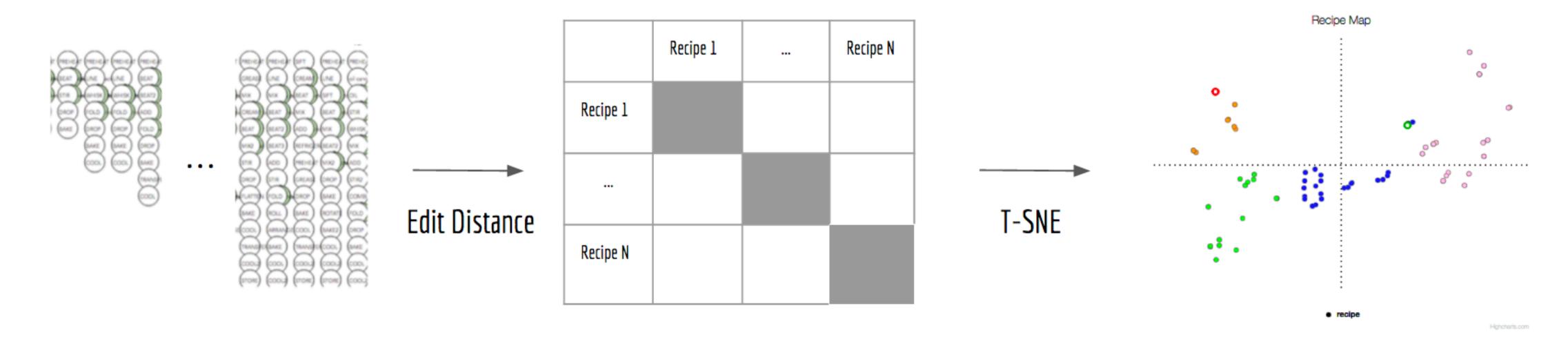


BAKE









# **VISION AND NEXT STEPS**



**RecipeScape:** Recipe analytics tool



Analyzing cooking recipes in aggregate and at scale helps us better understand collective knowledge and practice around cooking.



Generalizable technique. Interesting & fun applications like makeup instructions, travel guides, path planning etc



Cooking is essentially applying different kinds of heat transfer to various ingredients. How can we utilize this insight?



Can we augment all recipes to support learning/cooking applications?



Video-based recipes?

# KAIST INTERACTION LAB

# kixlab.org Minsuk Chang minsuk@cs.kaist.ac.kr

#### **RECIPE TAGGER INTERFACE**

| Recipe Tagger<br>Navigate              |         |         |         |
|--|---------|---------|---------|
| Recipe 1 - Sentence 3 -                |         | GO      | NEX     |
| Sentence                               |         |         |         |
| Sprinkle with 1/2 cup nuts ; press nut | ts into | dough . |         |
| Available Tags                         |         |         |         |
| Ingredients                            |         | C       | Cookinę |
| 1                                      |         |         | 2       |
|  |         |         |         |
|  |         |         |         |





