



CONTENTS

THE UNDERLYING PROBLEM	02
HOW DOES AI AND FOOD SCIENCE BLEND	03
A DEEPER LOOK AT FLAVOR PAIRING	05
BLUEPRINT OF RECIPES	11
IMPACT OF BLUEPRINT RECIPES ON INGREDIENT FLAVOR MATCH SCORES	12
WHY DOES IT WORK?	16
LOOKING AHEAD	17



SUMMARY

Strawberries on burgers? Vanilla tamarind ice-cream? These combinations may, at first, seem like they wouldn't go together, but can turn out to be spectacular new taste sensations.

Wondering how? Flavor encompasses both aroma and taste, which is the defining characteristic of how we taste the food. The flavor is created by receptors in the mouth and nose, discovering chemicals found within food. These receptors respond by processing signals that are deciphered by the brain as sensations of taste and aroma.

For example, tamarind tastes the way it does because of the unique combination of chemicals found naturally within it and perceived by our tongues, noses, and brains as the distinct blend of sweet and sour tastes, and volatile aromas characteristic to the fruit.





HOW DOES AI AND FOOD SCIENCE BLEND

The confluence of AI and fundamental sciences has led to the building of many powerful applications, e.g., aeronautical simulations, physics engine, and drug discovery, to name a few. Formulations of the problem are done by using the principles of science and then later solved using AI techniques. This is a compelling paradigm for problem-solving as it retains the explainability factor because fundamental sciences have got strong theoretical foundations.

The internet is an enormous collection of connected dots of information. However, here's the thing, those connections are not visible, and the number of dots is growing at an exponential rate. At Spoonshot, we use Al techniques, like Natural Language Processing and Computer Vision technologies, to build structured information from unstructured data. We do this by leveraging food science principles to establish relationships between these information dots. Depending on the application or insight that is delivered, the appropriate datasets and connection types are used.

We collect information relating to the physical and chemical properties of ingredients and understand how ingredient interactions impact a final recipe, to build insights that are valid and relevant to you. Currently, our database contains volatile compounds for each ingredient, their sensory flavor profile, and the nutritional breakdown of ingredients. We use publicly available data, e.g., web, academic articles, and patents, to get this information.

Without the detailed flavor profile or chemical breakdown of an ingredient, it is tough to relate seemingly unrelated ingredients to each other, e.g., sugar, bananas, and strawberries all contain varying amounts of sugars and therefore, can be considered sweet.



A DEEPER LOOKAT FLAVOR PAIRING

A hypothesis, which over the past decade has received attention among some chefs and food scientists, states that ingredients sharing flavor compounds are more likely to taste well together than ingredients that do not.

To understand if a combination of ingredients will be a good flavor match, we first need to get data regarding the flavor profile of ingredients and understand their role in any particular formulation. The flavor profile of ingredients includes the volatile compounds and the dominant aroma/taste of a specific ingredient.

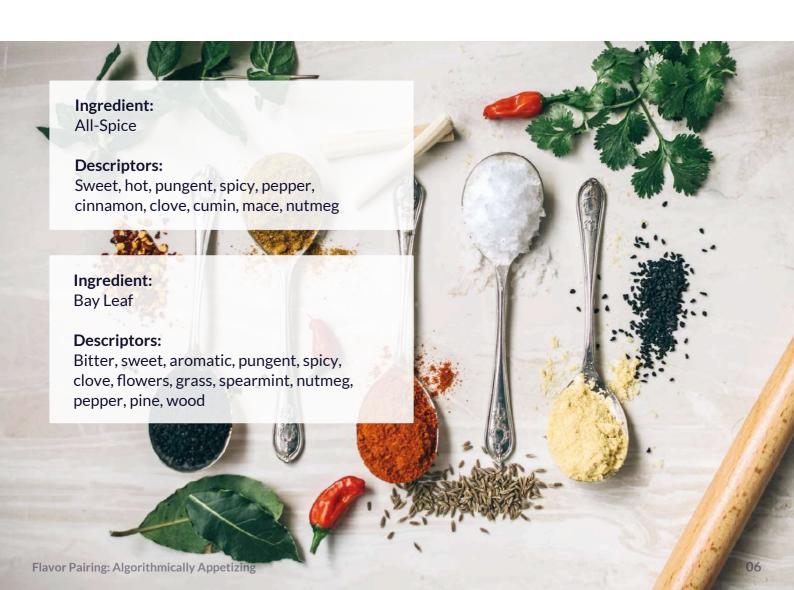
Findings by Ahn et al. further indicate that Western cuisines show a tendency to use ingredient pairs that share many flavor compounds, supporting the so-called food pairing hypothesis. By contrast, East Asian cuisines tend to avoid compound sharing ingredients. Therefore, this could be one way of discovering ingredient pairs that are appealing to the Western consumer.

Some of the unique combinations that have emerged through traditional flavor pairing are blue cheese and chocolate*, and strawberry and basil. If we can tag ingredients with their respective dominant sensory descriptors, the prediction of new flavor combinations could become even more useful.

The Fat duck cook book by Blumenthal Heston

EXAMPLE:

AROMA COMPOUNDS + AROMA DESCRIPTORS



If you look at the dominant descriptors for the above two ingredients, you can see that they share six of their descriptors, which would indicate that these two ingredients may go well together.

When analyzing the top 10 ingredients that go well with each ingredient in our database, we found that 32% of the ingredients show significant changes in their top flavor matches when using both aroma compounds and their descriptors rather than just using aroma compounds. Therefore, you can get a more accurate result when adding aroma compounds and their descriptors.

Let's look at another example - Vanilla. The top 10 ingredients that go well with vanilla are listed here, where the aroma compound pairing suggests that fruits go well with vanilla. There is an increase in the diversity of ingredients with the inclusion of descriptor pairings.

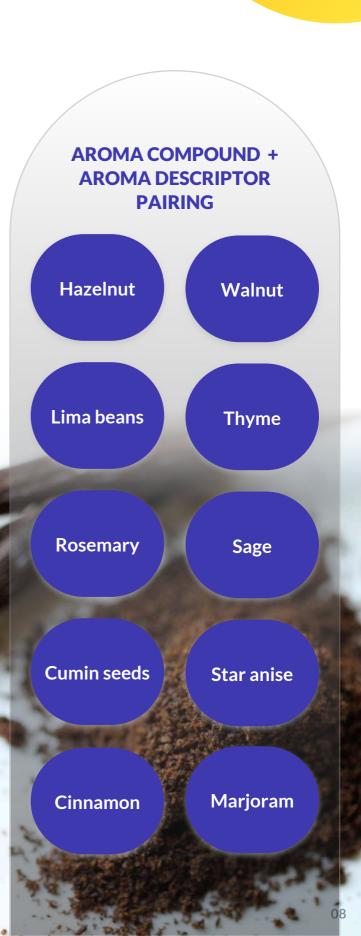
Ingredients in a particular ingredient family would share a lot of similar compounds; therefore, when using only the compound pairing theory, you can expect to get a relatively less diverse set of top flavor matches. Also, because these descriptors represent the dominant flavors in the particular ingredient, using both descriptors and compounds should be more accurate.

Flavor Pairing: Algorith

VANILLA

AROMA COMPOUND PAIRING Red apple Pineapple Tomato Strawberry Passion fruit Cocoa bean Banana **Papaya** Mango Guava

Flavor Pairing: Algorithmically Appetizing



There are other generalizations about flavor pairing that can be used to predict combinations better. Over the years, chefs have talked about balancing and complementary pairs. For example, we all know that sweet ingredients complement spicy, sour, and balance out bitter ingredients. These generalizations could be another way to discover new pairs that go well together.

Even with the addition of aroma descriptors, the flavor pairing theory is limited in predicting ingredients that go well together. Research has shown that contrasting flavor profiles are more likely to be used in recipes in Asian cuisine.

Therefore, though the flavor pairing theory can be useful in predicting ingredients that could work well together, it can never be the only reason why ingredients are used together.

There is more to using flavor agents than just their similarity of flavor profiles. Herbs and spices have been historically used for their antimicrobial activity or to prevent spoilage of food. Some researchers have found a correlation between the frequency in the use of spices and the climate of the country. Other flavors such as sweet and umami ingredients have evolutionarily been used because they are indicators of calorie-rich, healthy food.

Since there are multiple reasons for using flavor ingredients in a particular recipe, we have to find alternatives to be able to mathematically calculate whether two ingredients go well together in terms of their flavor.

What if we could understand the role of ingredients in recipes to then dive deeper into the creative space of the formulation to recognize which ingredients are commonly used together, particularly for their flavor.



BLUEPRINT OF RECIPES

We have divided our recipe and ingredient database (> 1.2 million recipes, approximately 5,000 natural ingredients) into several categories.

For each recipe type, we first define ingredient families that make up the functional component of the formulation and also include signature ingredients inthe particular recipe. For example,

Recipe Type: Cake

Ingredient Families (functional): Flour, Dairy Fat, Egg, and Sugar or Sweetener, Leavening Agent

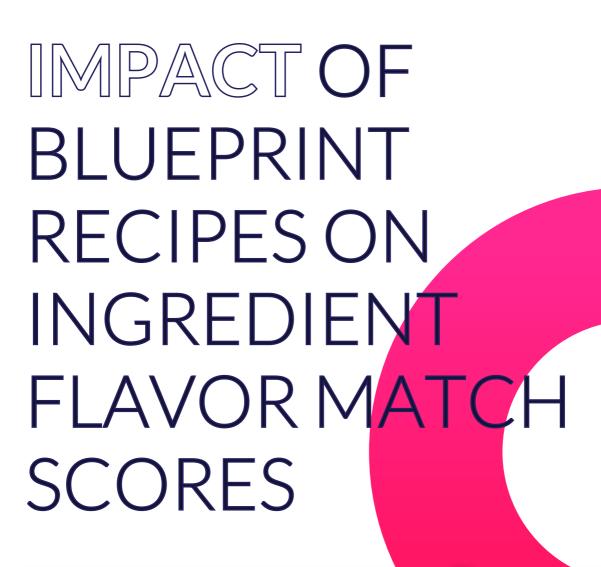
Recipe Type:

Pizza

Ingredient Families (functional): Flour, Leavening Agent

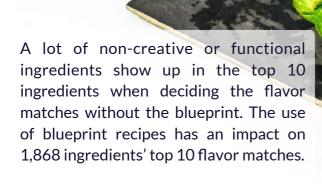
Ingredient Families (signature): Cheese





INGREDIENTS

12



SUGAR'S TOP 10 MATCHES

Without Blueprint

With Blueprint

Salt

Butter

Eggs

Water

Milk

Vanilla essence

All-purpose flour

Plain flour

Baking powder

Lemon

Vegetable oil

Tomato

Vinegar

Buttermilk

Extra virgin olive oil

Condensed milk

Wheat flour

Thyme

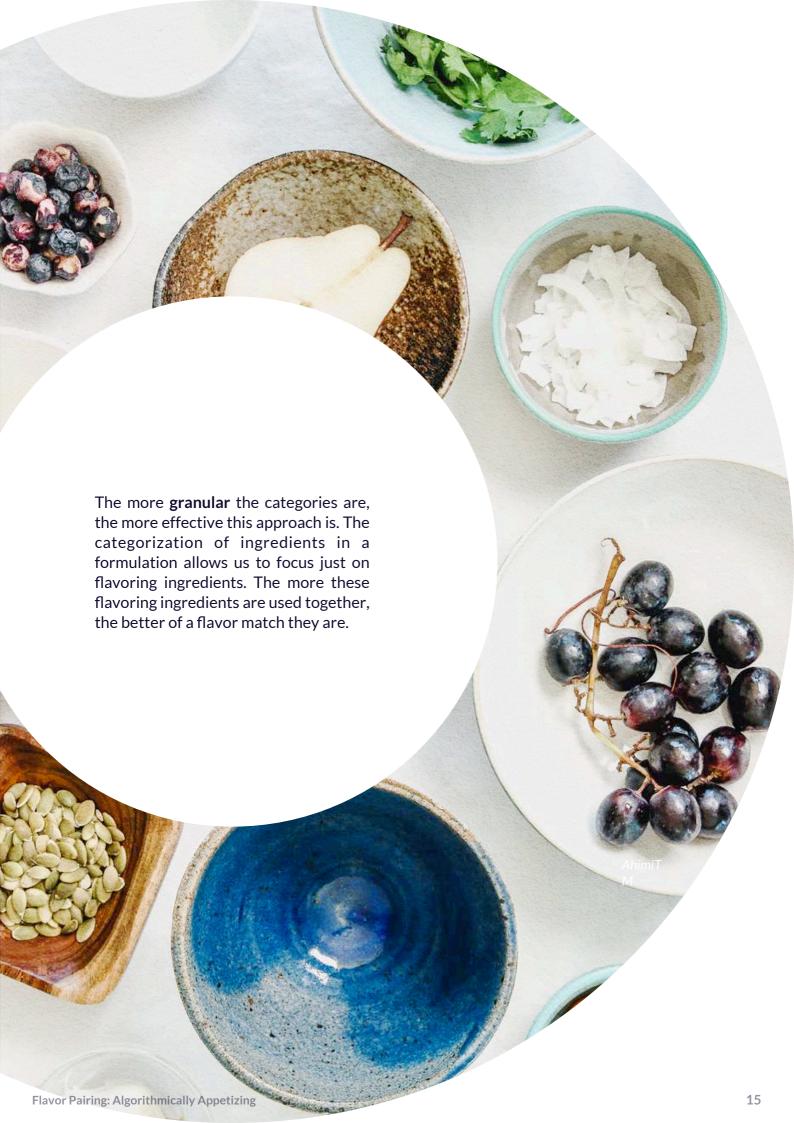
Vanilla essence *

Vanilla

Repeated in both

MOZZARELLA CHEESE'S TOP 10 MATCHES

With Without **Blueprint** Blueprint Tomato* Salt Olive oil Water Garlic **Onions** Sugar * Oilve oil Extra virgin **Black pepper** olive oil **Parmesan** Sugar cheese* **Plain flour Parsley** Oregano **Yeast Parmesan** Sea salt cheese Plain flour **Tomato**





Finding patterns in formulations and why two ingredients are used together is complex. Synergistic flavors are more likely to be used together and work well (at least for the Western palette). However, this is not the only reason ingredients pair well together. Contrasting flavors are sometimes needed in a recipe to balance out strong, dominant ingredients.

A rich recipe database from across the world allows us to account for these "other" factors. The one downside of this approach is that the prediction of new ingredient flavor matches is not theoretically possible to do when looking for frequency of ingredients in recipes.

To predict new ingredient matches, determining adjacency of ingredients will be essential. Tagging ingredients with benefits, their functional/flavoring role, and a recipe database might allow us to find relevant patterns. Therefore, more research is required to find better, universal solutions.



Overall, it is essential to understand that the 'whys' of flavor combinations are very varied. To discover new and accurate pairs, we have to use a multitude of approaches. Tagging the origin of flavors, their health benefits, and determining adjacency of ingredients will be critical to improving the prediction of a flavor match further.

To predict a trio of ingredients or full-fledged recipes, a more nuanced theory explaining the use of ingredients in a variety of cuisines will be useful. Research has suggested that when two ingredients (A, B) do not share aroma compounds, the use of an ingredient C that shares aroma compounds with both A and B makes the combination more likely to occur in recipes.

Also, to recommend complete recipes, we would have to include functional ingredients as well, which would mean understanding the texture compatibility of ingredients.





ABOUT SPOONSHOT

Spoonshot is a food AI company that is raising the bar for insight-led innovation. Spoonshot's belief is that exploration is the catalyst behind the novel, successful products, the very fuel to help food and beverage companies shape the future, toset the trend.

Spoonshot equips the food and beverage industry with unprecedented foresight of emerging market needs. By transforming long-tail, open information from diverse, authentic sources, Spoonshot's proprietary food science infused algorithms connect disparate data sets, to deliver personalized insights, predict trends, and identify novel opportunities. Today, Spoonshot is supporting the world's best-known brands in meeting the future needs of its customers. For more information, please visit spoonshot.com.

To request a demo of our Al-powered insights platform, send us an email at hello@spoonshot.com





SPOONSHOT®

Be The Trendsetter











