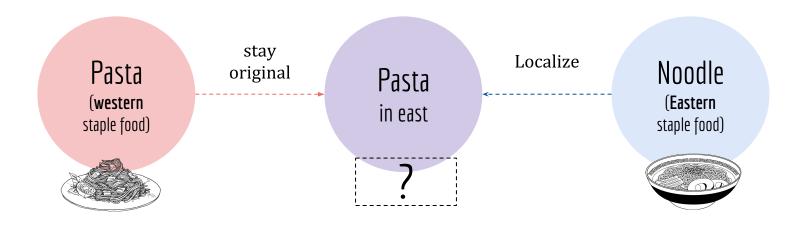


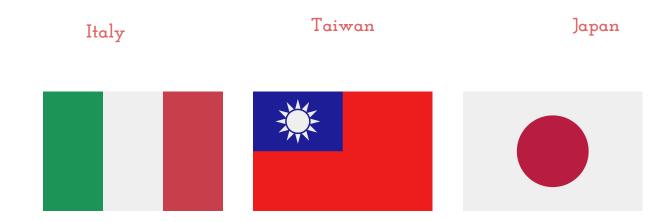




Pasta, as the most popular global food, is the food experiences influenced by local preference or it keep its original style?



Based on 3 Countries



Discover 3 Food experiences

Ingredient network



Flavor network



Color network



Question

Ingredient network



Whether pasta are made different in east and west according to the ingredients?

-

Flavor network



Whether the taste preference of pasta change due to the preference of local staple food?

Color network



Whether the visual preference of pasta change due to the preference of local staple food?







Ingredient Network - IP 7.1

Elena Camuffo, Laura Crosara, Matteo Moro

Ingredients Network analysis - why?

The aim of our group is analyzing the ingredients that are used for pasta in three different countries: Italy, Taiwan and Japan, in order to give the following questions an answer:

Which are the most popular ingredients used for pasta in different cultures? Are these ingredients similar or different? How similar the eastern pasta is to western pasta vs. eastern noodle?







Data Collection





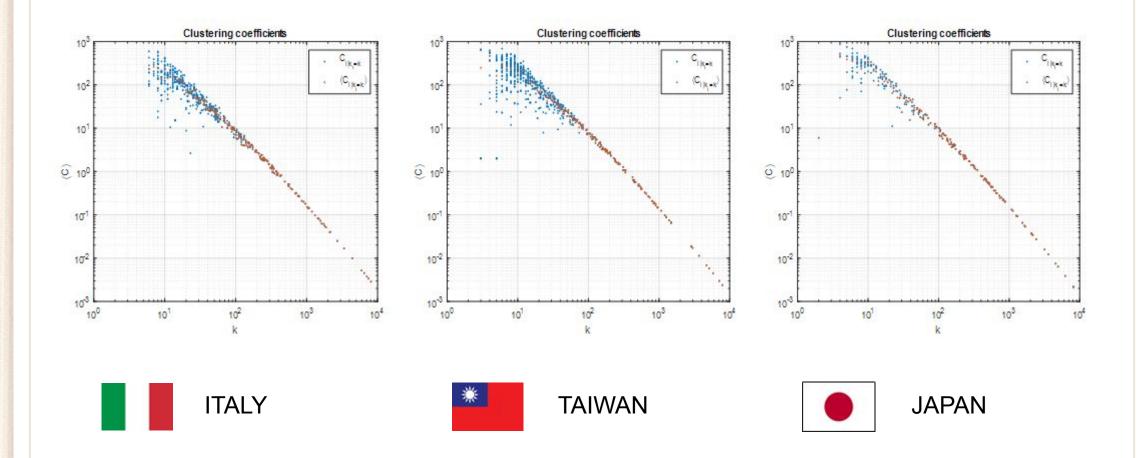
Analysis Results - projected network



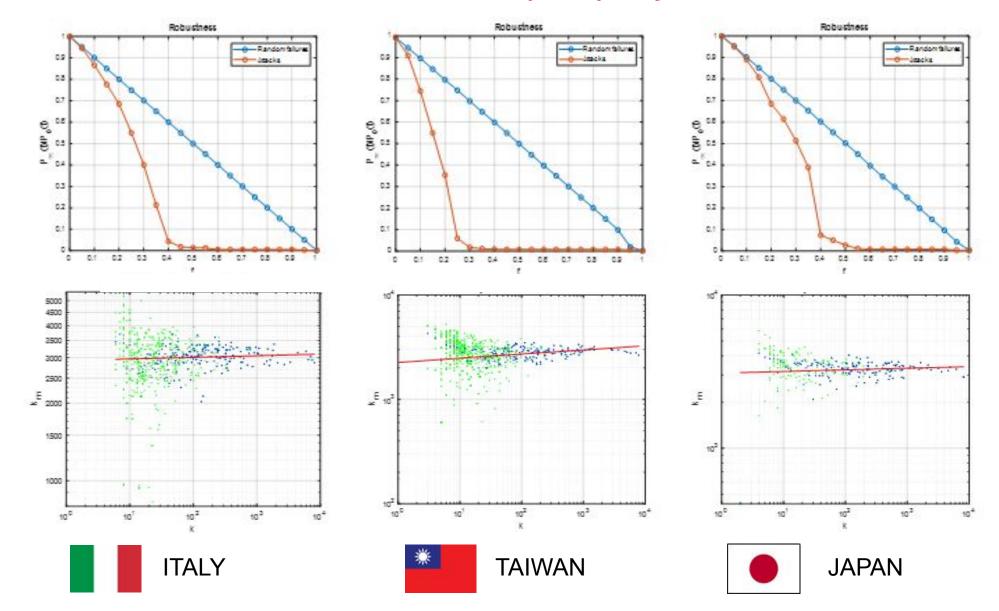
| | Italy | Taiwan | Japan |
|---------------------|-------|--------|-------|
| Number of nodes N | 500 | 659 | 257 |
| Number of links L | 22790 | 21334 | 11038 |

| | | * | |
|------------------|----------|--------------|----------|
| Average Distance | 2.1389 | inf (2.1778) | 2.1625 |
| Diameter | 5 | Inf (5) | 5 |
| Average degree | 199.6295 | 138.1487 | 343.3074 |
| Y | 1.8134 | 1.7334 | 1.7059 |

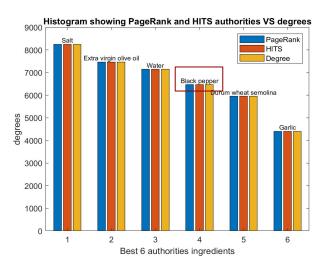
Clustering Coefficients - projected network

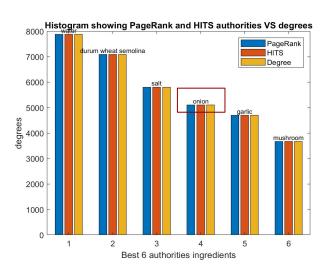


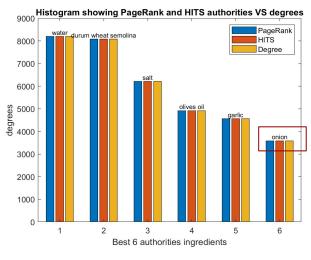
Robustness & Assortativity - projected network



Ranking - projected network











TAIWAN



WESTERN HUBS:

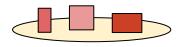
pepper

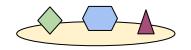
IN COMMON:

Salt Olive Oil Water Semolina Garlic

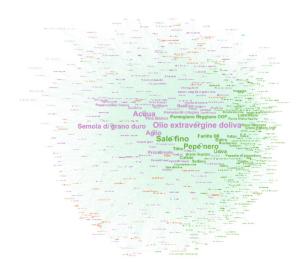
EASTERN HUBS:

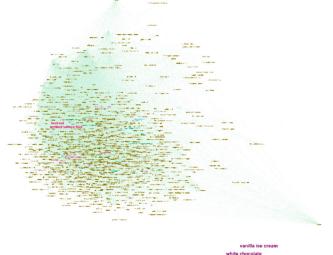
onion mushrooms

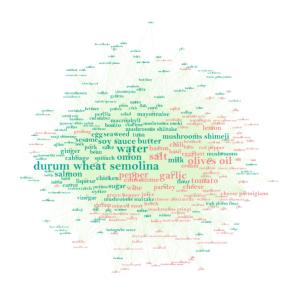


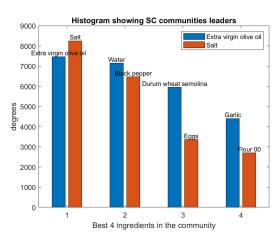


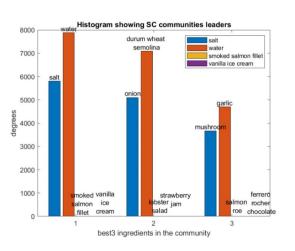
Communities - projected network



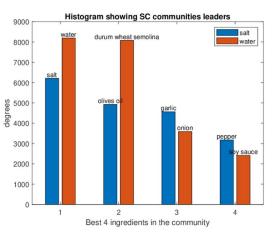








TAIWAN





JAPAN

ITALY

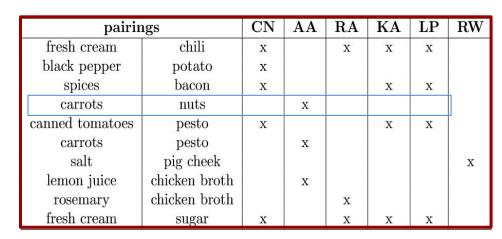
Link Prediction - projected network

| pairin | gs | $\mathbf{C}\mathbf{N}$ | AA | RA | KA | LP | RW |
|-------------------------|----------------|------------------------|----|----|----|----|----|
| Nutmeg | Fresh chilli | X | | | X | X | |
| Liquid fresh cream | Carrots | X | | | X | X | |
| Tomato sauce | Pine nuts | X | | | X | X | |
| Butter | Mussels | x | | | X | X | |
| Salt | Nduja | | | | | | x |
| Pig cheek | Pumpkin | | X | | | | |
| Pig cheek | Ricotta cheese | X | | | | | |
| Sausage | Pecorino | | | X | | | |
| Whole milk | Beans | | | X | | | |
| Whole milk | Onions golden | | X | | Х | Х | |

| | pairings | $\mathbf{C}\mathbf{N}$ | AA | RA | KA | LP | RW |
|--------------------------|-------------------|------------------------|----|----|----|----|----|
| cheese | sesame | X | | | х | X | |
| macrophyll | bean | | | X | | | |
| salt | sweet sauce | | X | | | | x |
| cabbage | lemon | | | X | | | |
| lemon | mushrooms maitake | | | x | | | |
| $\operatorname{chicken}$ | vegetables | | | X | | | |
| cabbage | cheese parmigiano | | | X | | | |
| consomme | perilla | X | | | X | x | |
| egg | lemon | Х | | Х | Х | Х | |
| bacon | vinegar | X | | | X | X | |









JAPAN



Link prediction - Bipartite network

| New Ingredient | Recipe |
|-----------------|--|
| Black pepper | Durum wheat semolina, Water, Ricotta salata, Eggplant, Garlic, |
| | Vine-ripened tomatoes, Basil, Salt, Extra virgin olive oil |
| Vegetable broth | Semolina durum whole wheat, Water, Fresh onion, Mushrooms, Bacon, |
| 20.70000 20 DO | Cannellini beans, Rosemary, Extra virgin olive oil, Black pepper, Salt |
| apple | onion, anchovies, water, olive oil |
| Brandy | Chicken breast, Noodles, Potatoes, Snow peas, Carrots, Celery, |
| | Mushrooms, Leeks, Water, Fresh ginger, Parsley, Extra virgin olive oil, Black pepper, Salt |
| Almonds | streaky pork, durum wheat semolina, water, minced garlic, |
| | plum, cauliflower, mushroom, soft-boiled eggs, rice wine, salt, flour |



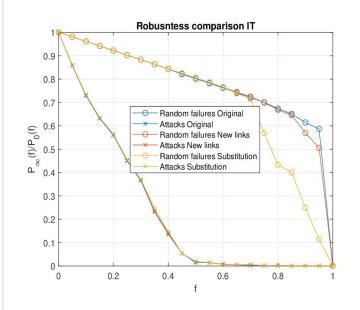
| New Ingredient | Recipe |
|----------------|--|
| mushroom | onion, meat, red wine, concentrated tomato paste, chicken broth, bay leaves, |
| | sugar, salt, durum wheat semolina, water, cheese, fresh thyme, black pepper |
| chia | streaky pork, durum wheat semolina, water, |
| | minced garlic, plum, cauliflower, mushroom, soft-boiled eggs, rice wine, salt, flour |
| cheese | durum wheat semolina, water, bacon, asparagus, |
| | shrimp, garlic, black pepper, rose salt, paprika, parsley leaf, cheese |
| basil leaves | durum wheat semolina, water, onion, cream, chicken breast, squid |
| avocado | durum wheat semolina, water, bacon, large tomatoes, green pepper, mushroom, |
| | cheese, ketchup, salt, black pepper |

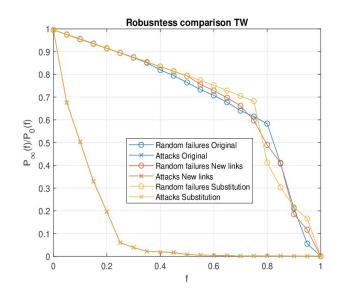


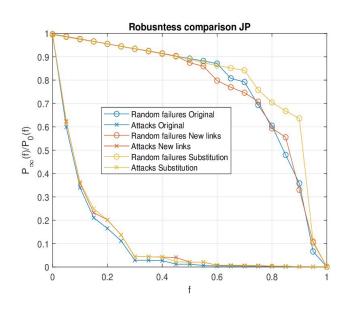
| New Ingredient | Recipe |
|----------------|--|
| consomme | durum wheat semolina, water, salmon, olives oil |
| tomato | onion, bacon, garlic, olives oil, cream, salt, cheese, durum wheat semolina, water, juice, nut |
| soy sauce | chicken, salt, durum wheat semolina, water, avocado, clams, mayonnaise, onion, cod roe |
| onion | durum wheat semolina, water, saury, salt |
| pepper | durum wheat semolina, water, salmon, olives oil |



Robustness of new links













''basil' -> 'lemongrass'
'black pepper' -> 'soy sauce'

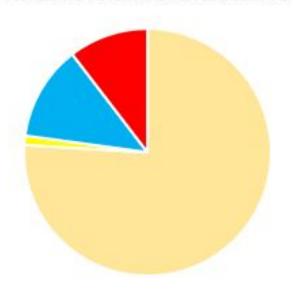
'black pepper' -> 'aivar'

'mushrooms' -> 'nuts' 'tomato' -> 'potesara' (potato sald)

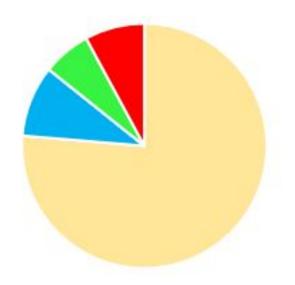
We can make substitutions!

CONCLUSIONS - pasta networks

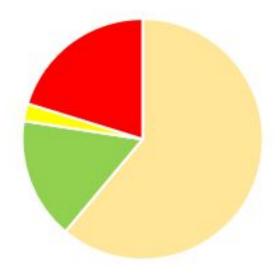
ITALIAN PASTA INGREDIENTS



TAIWANESE PASTA INGREDIENTS



JAPANESE PASTA INGREDIENTS

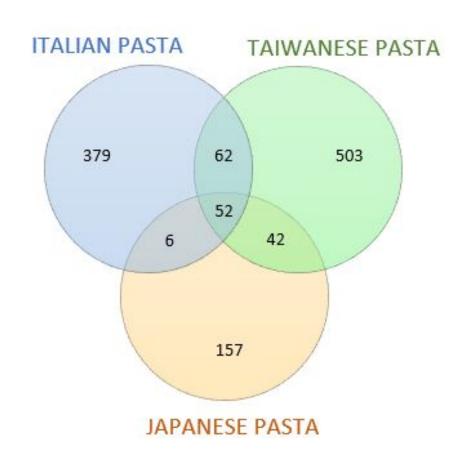


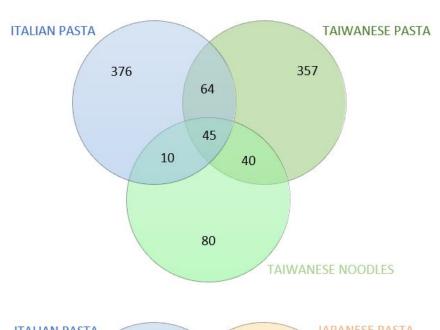
- ONLY IN THAT COUNTRY
- ITALY & TAIWAN

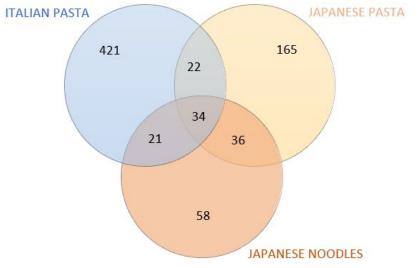
- ITALY & JAPAN
- ITALY & JAPAN & TAIWAN

TAIWAN & JAPAN

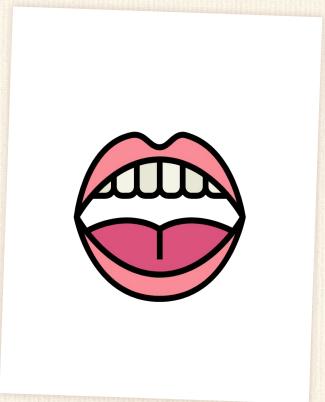
CONCLUSIONS - pasta & noodles













Flavor Network - IP 7.2

Federico Fiorenzoli, Aniello Xie

Flavor Analysis - Why?

Starting from this hypothesis:

"Westerns tend to use ingredients that share flavors to cook while Easterns avoid foods that share the same flavors in their dishes"

<u>01</u>

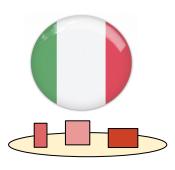
<u>Q2</u>

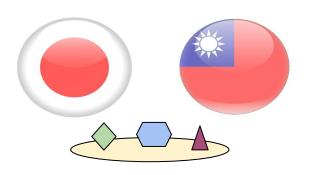
<u>Q3</u>

Does pasta dishes follow this hypothesis?

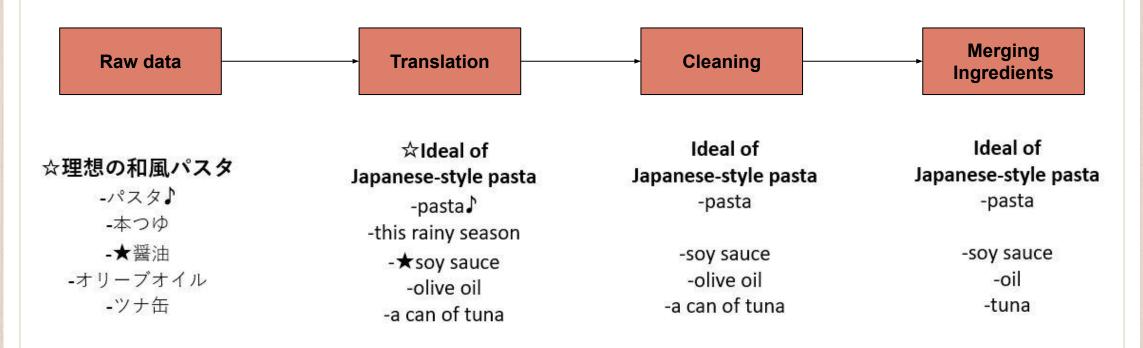
How similar are the eastern pastas with the Italian ones?

How similar are eastern pastas respect eastern noodles?





Data Scraping 1

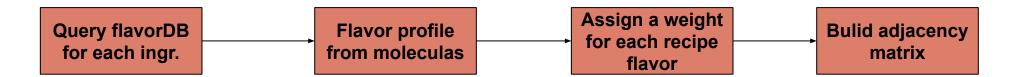






5 dataset * <1000 recipes> * <5 ingredients>

Data Scraping 2

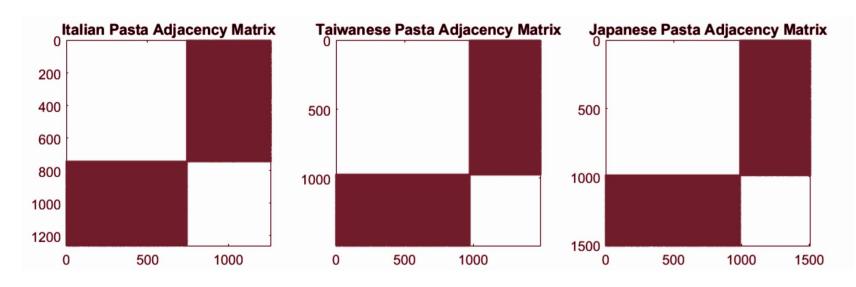




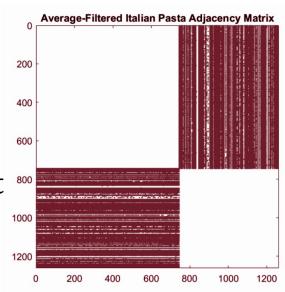


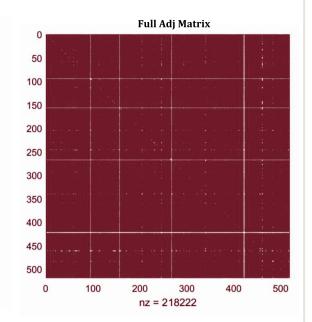
| (+)-Delta-Cadinene | herbal, woody, thyme, wood, medicine, dry | , |
|------------------------------|---|------------------------------|
| (+)-Neomenthol | camphoraceous, minty, sweet, mentholic | |
| (-)-Epicatechin | bitter | |
| (-)-Epicatechin Gallate | bitter | |
| (-)-Epigallocatechin | bitter | |
| (-)-Epigallocatechin Gallate | bitter | |
| (2E,4E)-Deca-2,4-Dienal | citrus, orange, nut, wax, meat, fat, fresh, fatty, oily, cucumber, sweet, | melon, pumpkin, fried, green |
| (E)-Hept-2-Enal | soap, vegetable, fat, fresh, fatty, pungent, almond, green | 8/271 |

Adjacency Matrix



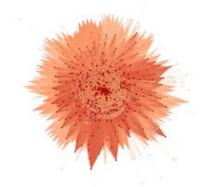
- Almost fully connected bipartite adjacency matrices
- Low link weight
- One big community with default Gephi function

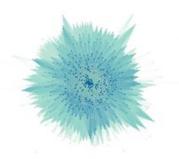






Pasta Flavor Network -Bipartite



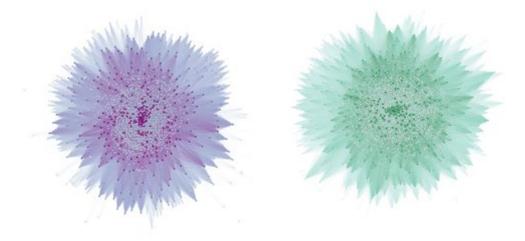




| Average Degree | 357 | 416 | 409 |
|---------------------|--------|--------|--------|
| Av. Weighted Degree | 2704 | 4096 | 3804 |
| Average Link Weight | 4.2913 | 6.0503 | 5.5562 |
| Network Diameter | 4 | 4 | 4 |
| Average Path Length | 1.903 | 1.902 | 1.907 |
| Y | 2.5281 | 2.2676 | 2.3516 |

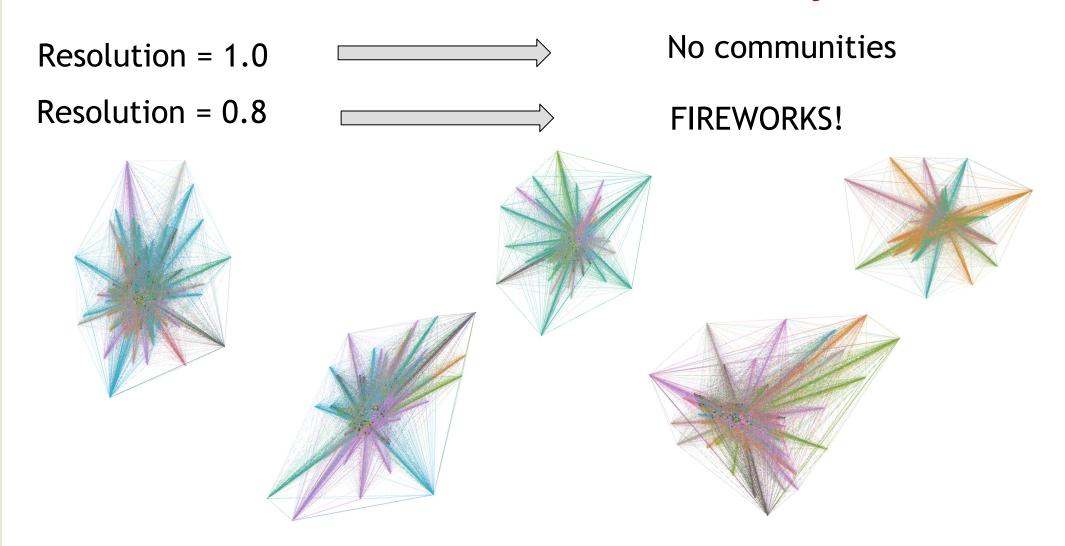


Noodles Flavor Network - Bipartite



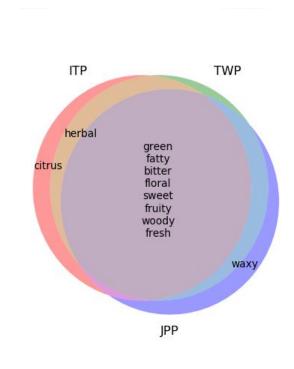
| Average Degree | 405 | 469 |
|---------------------|--------|--------|
| Av. Weighted Degree | 2853 | 2730 |
| Average Link Weight | 7.8522 | 5.9958 |
| Network Diameter | 4 | 4 |
| Average Path Length | 1.941 | 1.985 |
| ¥ | 2.6776 | 2.1871 |

Flavour Network Community



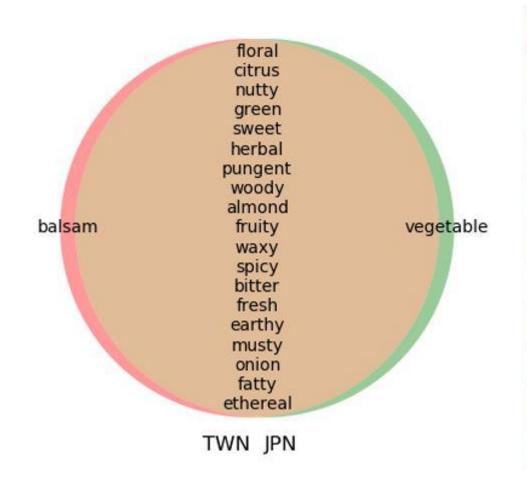
Only interesting thing: TOP5 FLAVOURS ARE ALMOST IN DIFFERENT CLUSTERS

Which are the most common flavours in the pasta dishes?



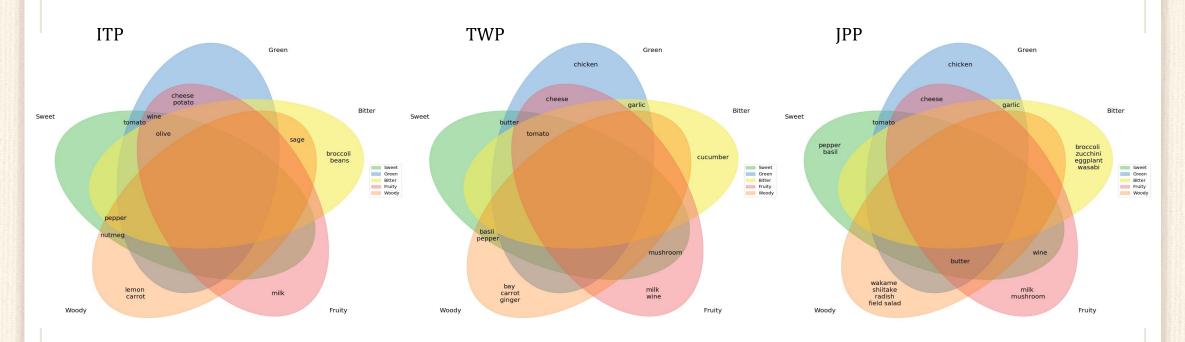
| Ranking | Italian P. | Taiwanese P. | Japanese P. |
|---------|------------|--------------|-------------|
| 01 | sweet | sweet | sweet |
| 02 | green | green | green |
| 03 | bitter | fruity | bitter |
| 04 | fruity | bitter | fruity |
| 05 | woody | woody | floral |
| 06 | herbal | floral | fatty |
| 07 | floral | fatty | fresh |
| 08 | citrus | nutty | woody |
| 09 | fresh | herbal | nutty |
| 10 | fatty | fresh | waxy |

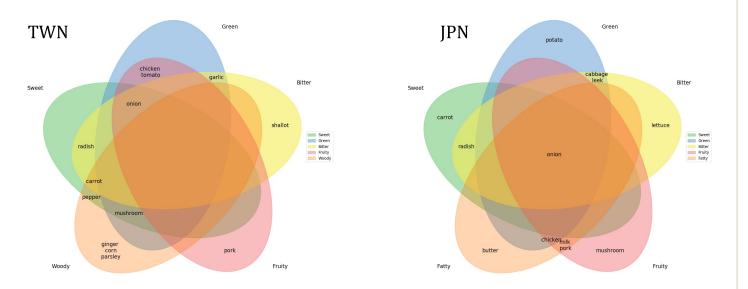
... Does noodle dishes follow the same behaviour?



| Ranking | Taiwanese N. | Japanese N. |
|---------|--------------|-------------|
| 01 | sweet | sweet |
| 02 | green | green |
| 03 | fruity | bitter |
| 04 | bitter | fruity |
| 05 | woody | floral |
| 06 | floral | fatty |
| 07 | fatty | fresh |
| 08 | nutty | woody |
| 09 | herbal | nutty |
| 10 | fresh | waxy |

Reverse Flavor Analysis





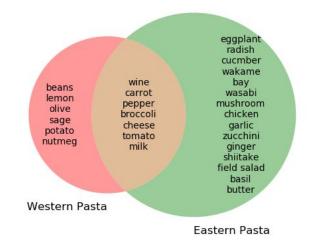
Hypothesis result

Recalling our initial hypothesis:

"Westerns tend to use ingredients that share flavors to cook while Easterns avoid foods that share the same flavors in their dishes"

WHAT WE HAVE DISCOVERED
In general Eastern pasta are more rich and tasty than Italians

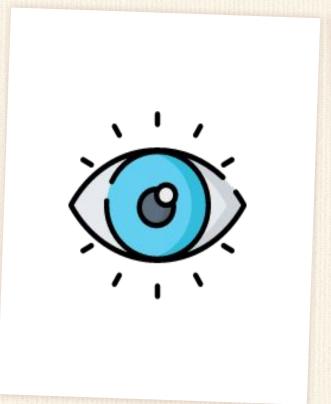
"Pasta Localization Effect"



...but is also true that filtering appropriately the flavours eastern pasta uses more ingredients than western









Color Network - IP 7.3

Giovanni Colotti, Daniele Lorenzi

Why analyze recipe colors?

We decided to use this different approach to try to find if different cultures have a preference for certain colors and to also see if it it is possible to divide the recipes in the 3 nations just by their colors

Which colors are more prevalent in the different cultures?

Is it possible to find the nationality of a recipe by its colors?







Colors-Recipes Networks

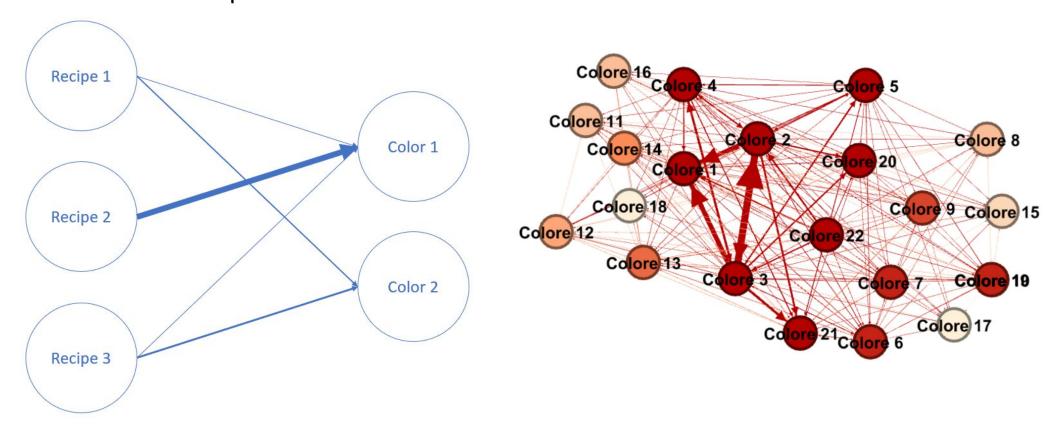
Bipartite networks:

colors and recipes

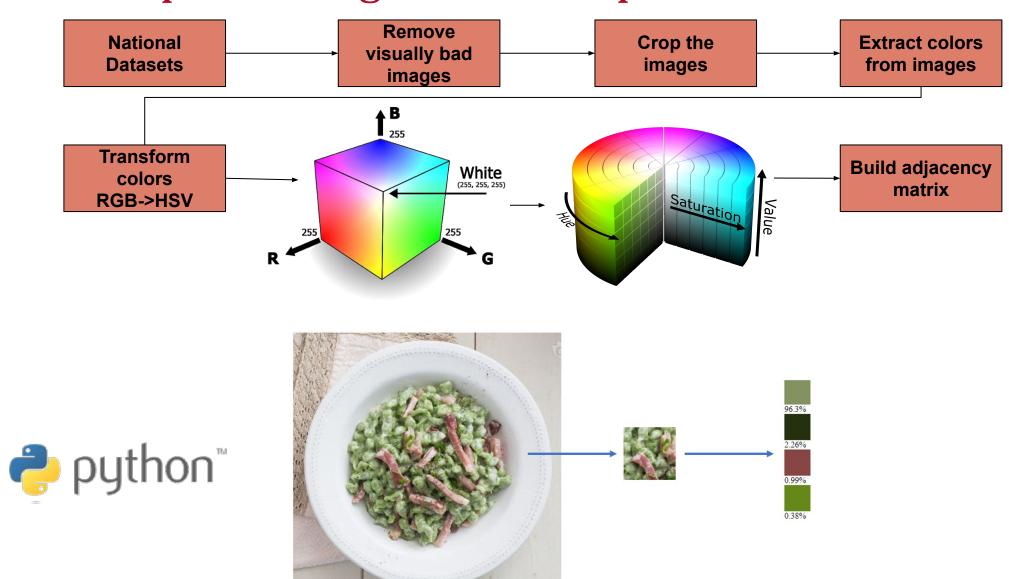
Projections of the networks

Colore 8

Colore 19

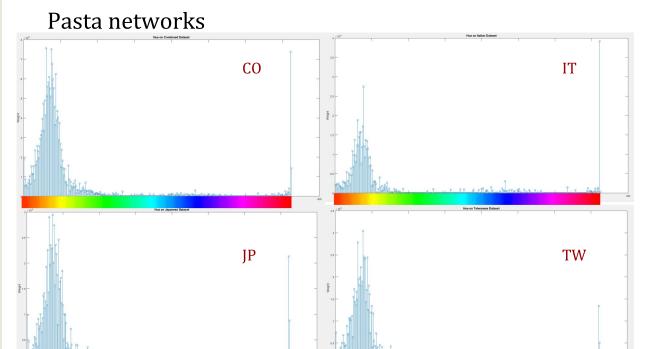


Color processing and color spaces



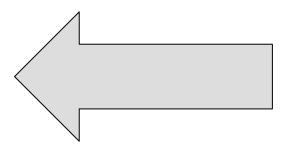
Color distributions





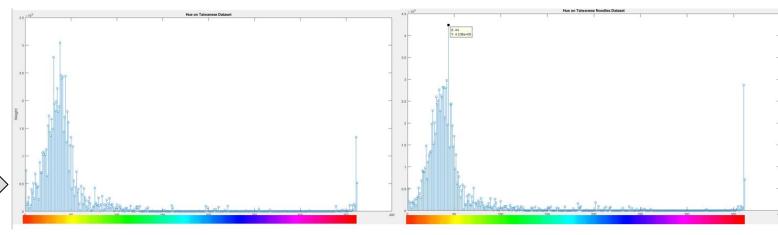
The color are distributed exactly in the same way, with minor differences

NOT possible to distinguish between nations



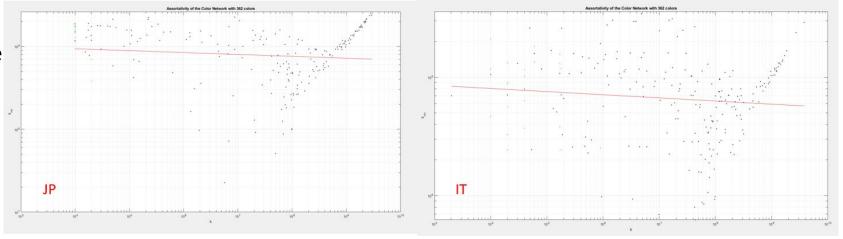
Pasta vs Noodles

The noodles colors are shifted to the right, noodles recipes are "more yellow"

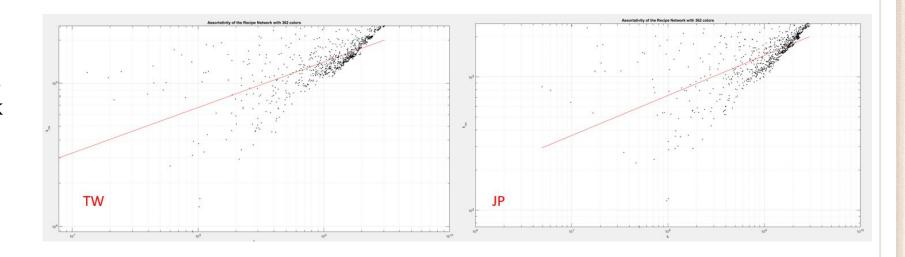


Assortativity on the recipes and colors networks

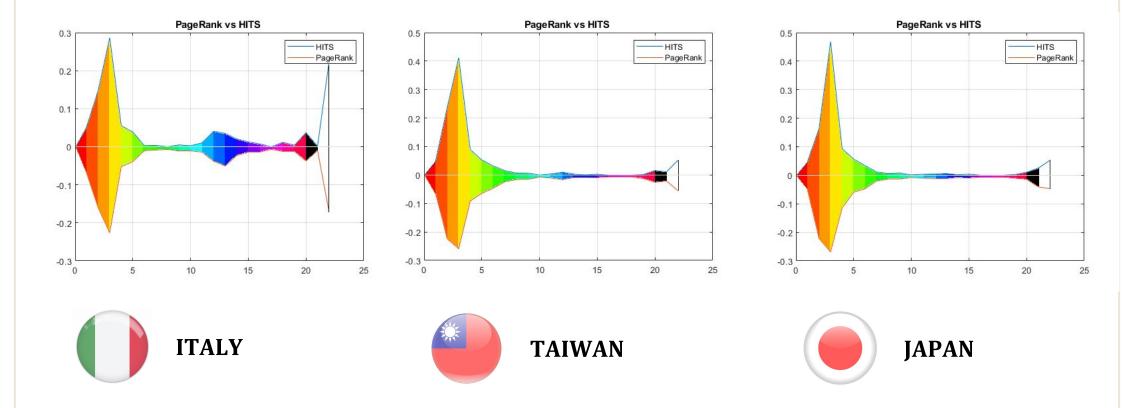
The colors form a neutral to disassortative network, the main colors (yellow, orange) do not connect together often



The recipes form an assortative network

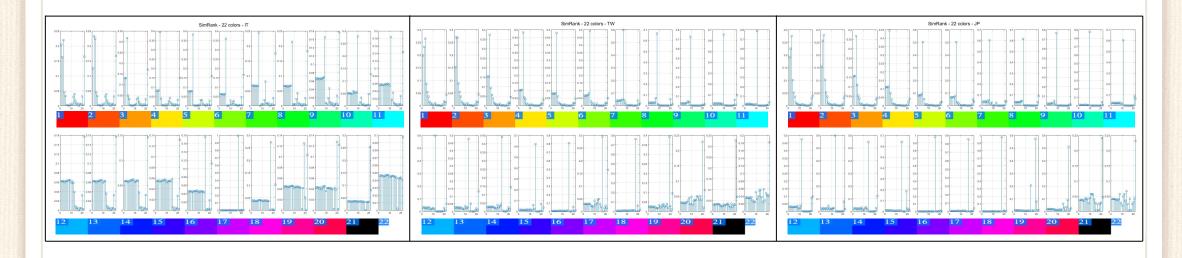


PageRank



- Red, orange and yellow as the most important colors
- Main differences between Italian and Asiatic data sets
- Color processing and HSV (saturation and value) issues on Italian set

SimRank





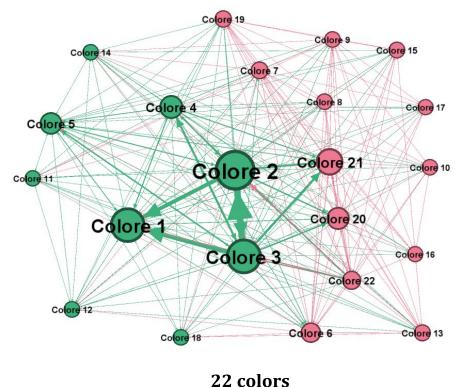




- Very homogeneous Italian network
- Main differences between Italian and Asiatic data sets
- Same color pairings for Taiwanese and Japanese recipes

Community detection



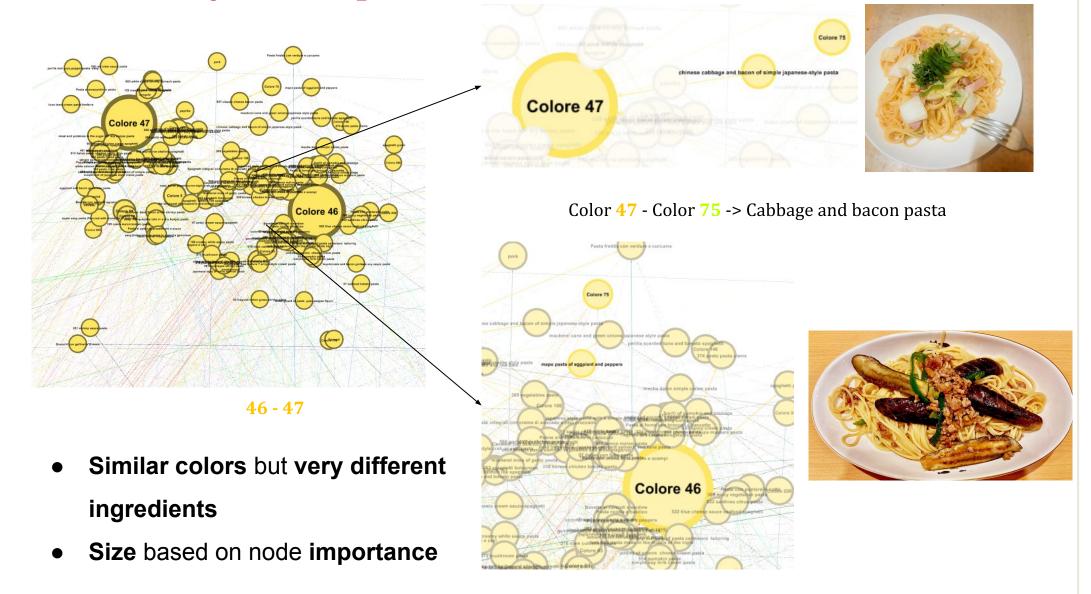


362 colors and recipes

- 2 communities: canonical and unusual
 recipes (colors)
- Size based on node importance

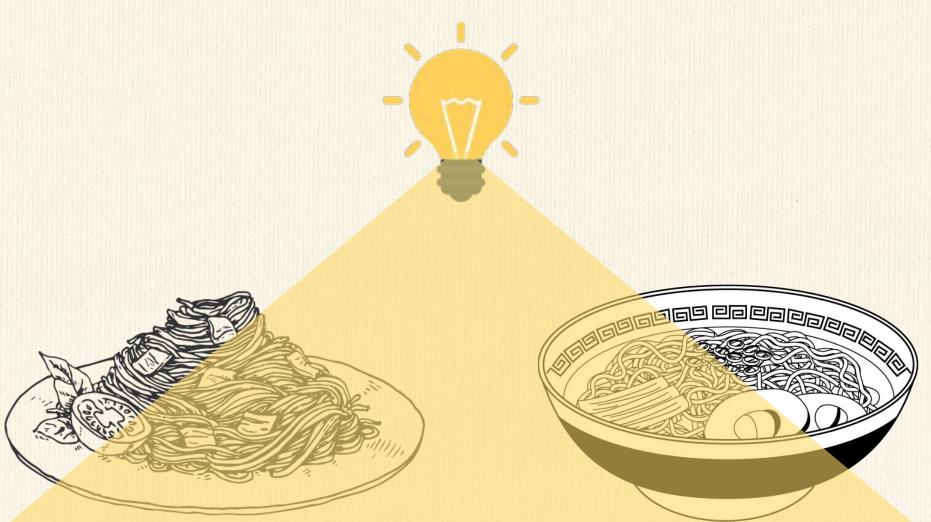
- No clustering based on recipes provenience
- Main colors hubs and other minors for each cluster

Community example



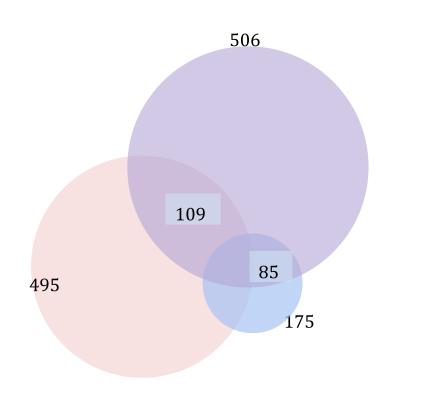
Color 46 - Color 75 -> Eggplants and green pepper pasta

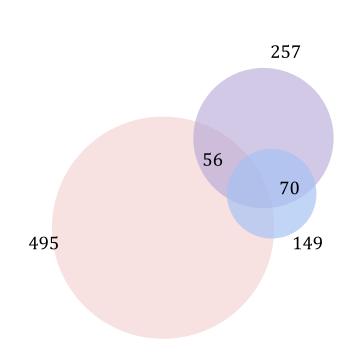
Insights





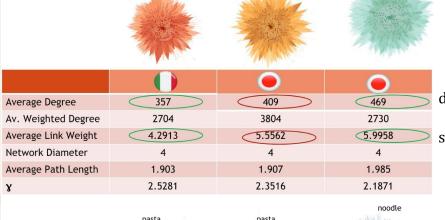
Pasta as new food or localize food?



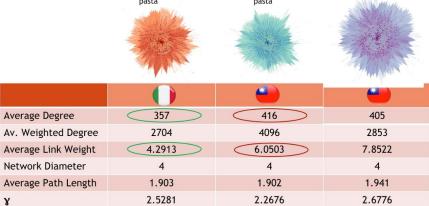


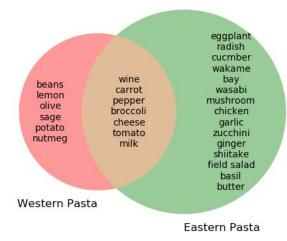


Does the pasta flavor change due to the preference of local staple food?

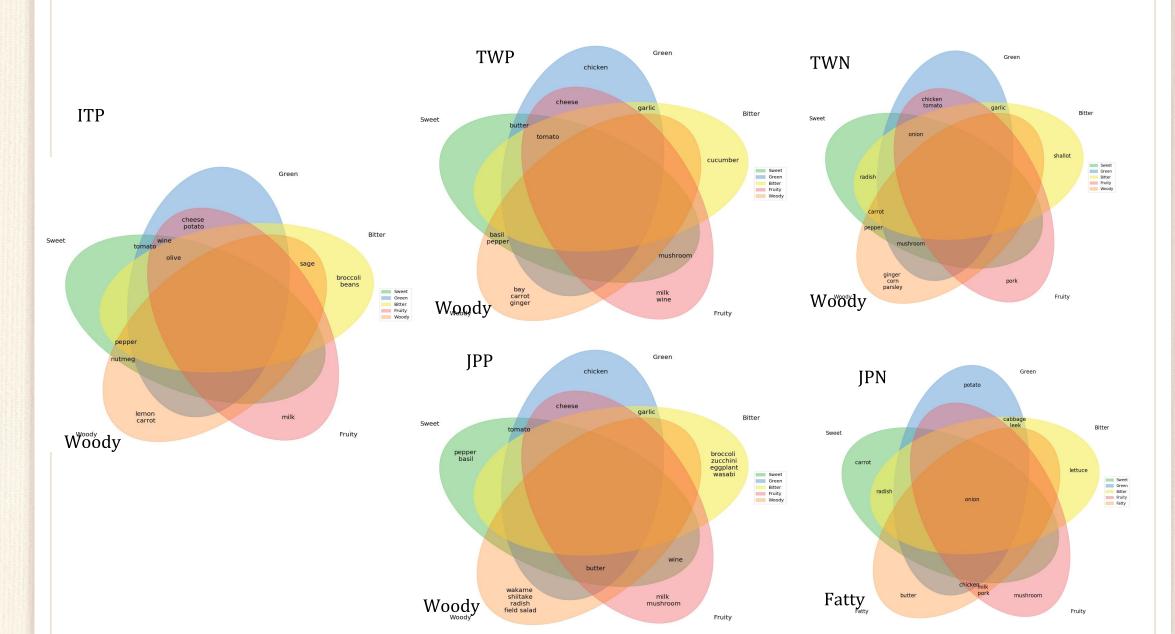


diversity of flavor strength of the flavor



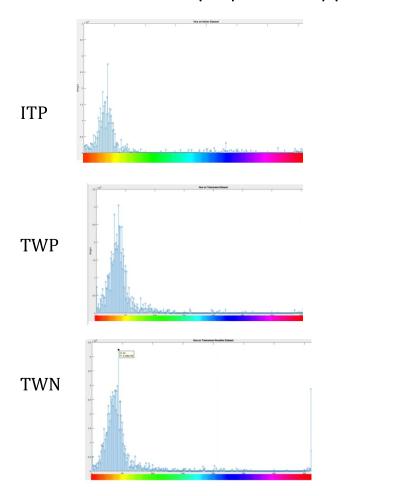


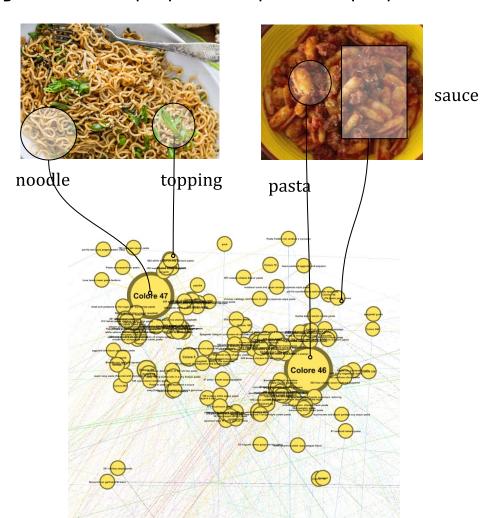






Is the visual preference of pasta change due to the preference of local staple food?





Role of each participant in the project



DANA - SOCIAL ANALYSIS



IP 7.1



ELENA – SECOND PART OF THE PASTA NETWORK ANALYSIS, MATRICES BUILDING AND EXCEL TABLES



LAURA - FIRST PART OF THE PASTA NETWORK ANALYSIS, EXCEL TABLES AND CONCLUSIVE DIAGRAMS



MATTEO - DATA COLLECTION AND ANALYSIS OF THE NOODLE NETWORK



IP 7.2



ANIELLO – DATA COLLECTION AND NETWORKS ANALYSIS



FEDERICO – DATA CLEANING, DATA PRESENTATION, REPORT AND POWERPOINT





DANIELE – COLOR SPACE AND PROCESSING, PAGERANK, SIMRANK, COMMUNITIES



GIOVANNI - COLOR SPACE AND PROCESSING, COLOR ANALYSIS, NETWORK PARAMETERS AND ASSORTATIVITY