



#### The idea:

 Build a network of collaborations between artists of different genres, capable of representing the current state of the italian music scene, which can be easily decomposed to analyze single genres

#### The questions:

- Is there any difference in the behaviours of artists of different genres? Any significant commistion between genres?
- Does the network show any assortative behaviour like most social networks? If so, is it structural? What about the single genres?

## Step 1:

Scraping the scrapeable



## <u>Scraping</u>

• I tried getting data that could be intended as a heterogeneous snaphot of the italian music scene as of today:

# Get first 1k artists in Italy for 8 different genres

- Rap
- Hip-hop
- Indie
- Indie-pop
- Pop
- Emo
- Punk
- Punk-rock



#### Artists' attributes:

- id
- Name
- Total followers
- Popularity
- Genre (metadata)



#### First:

Filter italian artists

(Check if in the "genres" metadata there is at least one between "ita-", "roma-", "neap-", "naple-", "milan-")

Remove duplicates

# Then: Identifying feats

- Select each artist
- Find on which albums and singles they appear on
- Store name of the artist on which album/single they appear on

## Final preprocessing steps

#### Aggregation of genres:

- Rap / Hip hopRap
- Indie / Indie-pop → Indie
- Emo / Punk / Punk-rockAlt

(Pop didn't need it)

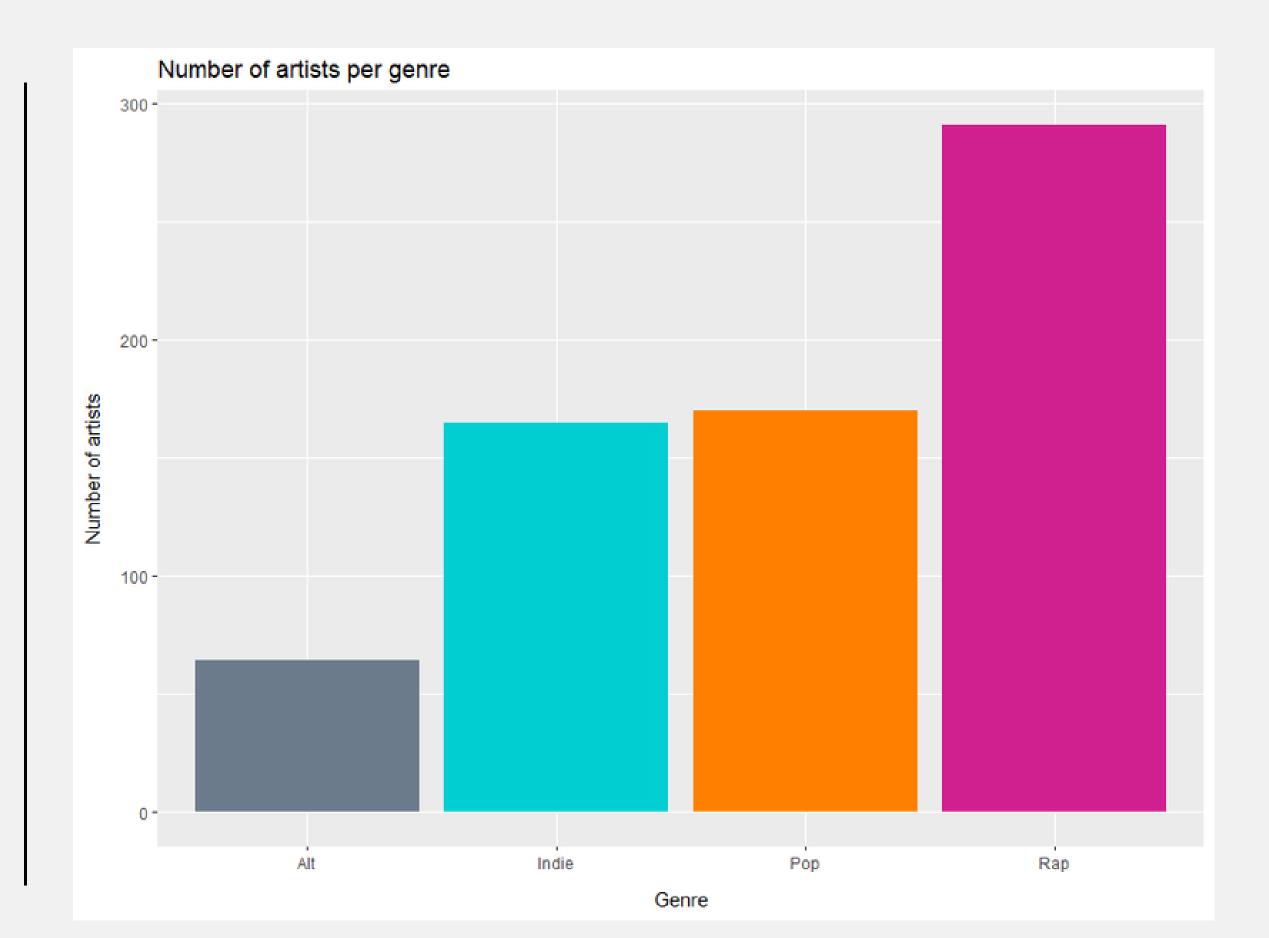
#### Change missclassified artists:

- Some artists are present in more than one genre
- When removing duplicates, some of them ended up in a less pertinent category
- 21 artists missclassified, most of them rappers in the pop category



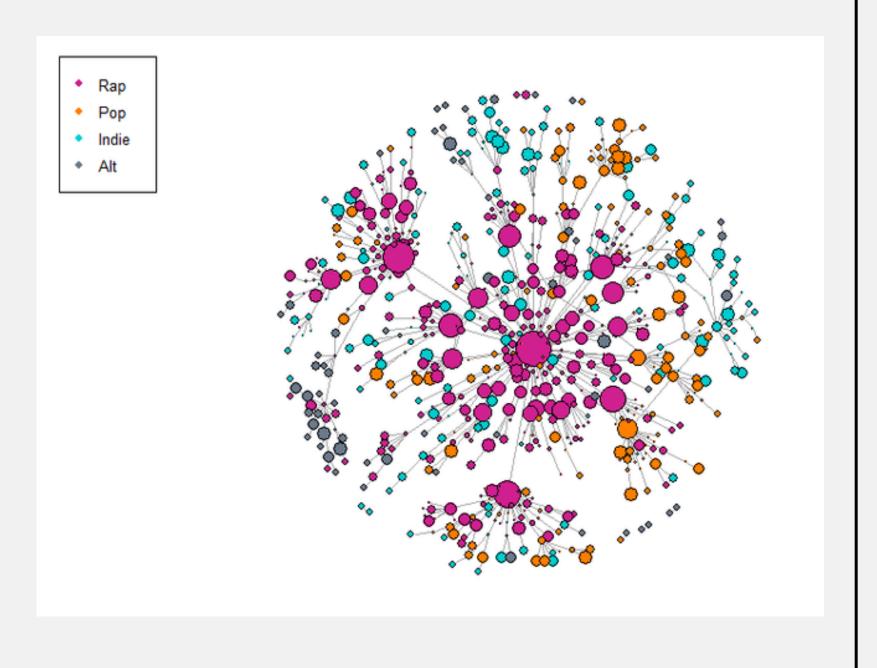
## Artists' collaboration network:

- 690 nodes
- 3297 edges
- No multi-edges
- $\langle k \rangle = 9.56$

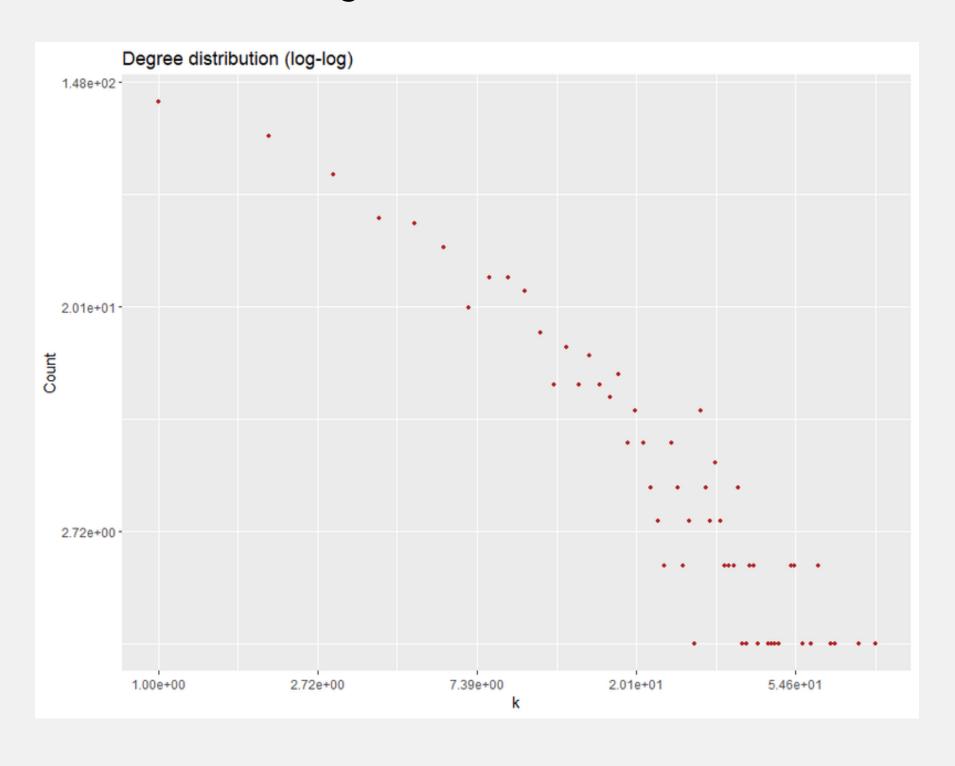


## **Artists' collaboration network:**

Network visualization



Degree distribution



## Are artists from different genres collaborating?

#### Contact layer of the mixing matrix:

|       | Alt | Indie | Рор | Rap  |  |
|-------|-----|-------|-----|------|--|
| Alt   | 26  | 24    | 7   | 58   |  |
| Indie | 0   | 196   | 128 | 327  |  |
| Рор   | 0   | 0     | 371 | 363  |  |
| Rap   | 0   | 0     | 0   | 1797 |  |

- 55% of the network's edges are between rap artists
- Rap artists "appear" in 77% of the edges



## Other segregation metrics:

#### Global segregation:

#### E-I index:

- Normalized difference between between-group ties and within group ties
- E-I index value = -0.45

#### Freeman's segregation index:

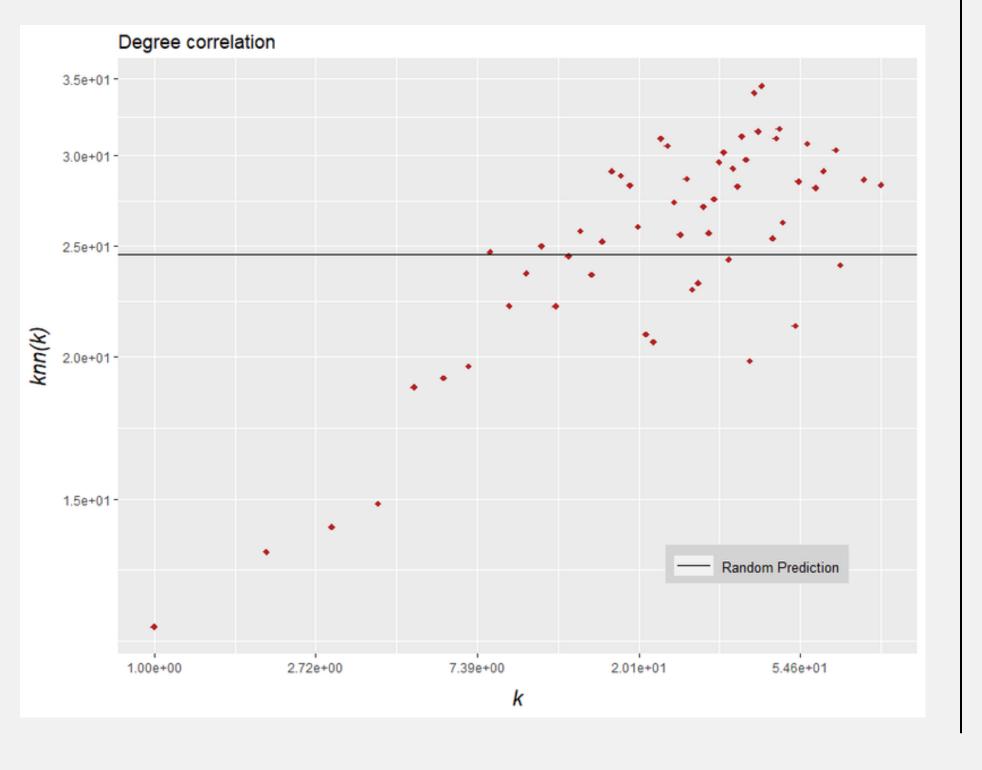
- Generalized version which allows the presence of more than two groups
- Freeman's index value = 0.6

Segregation between specific genres:

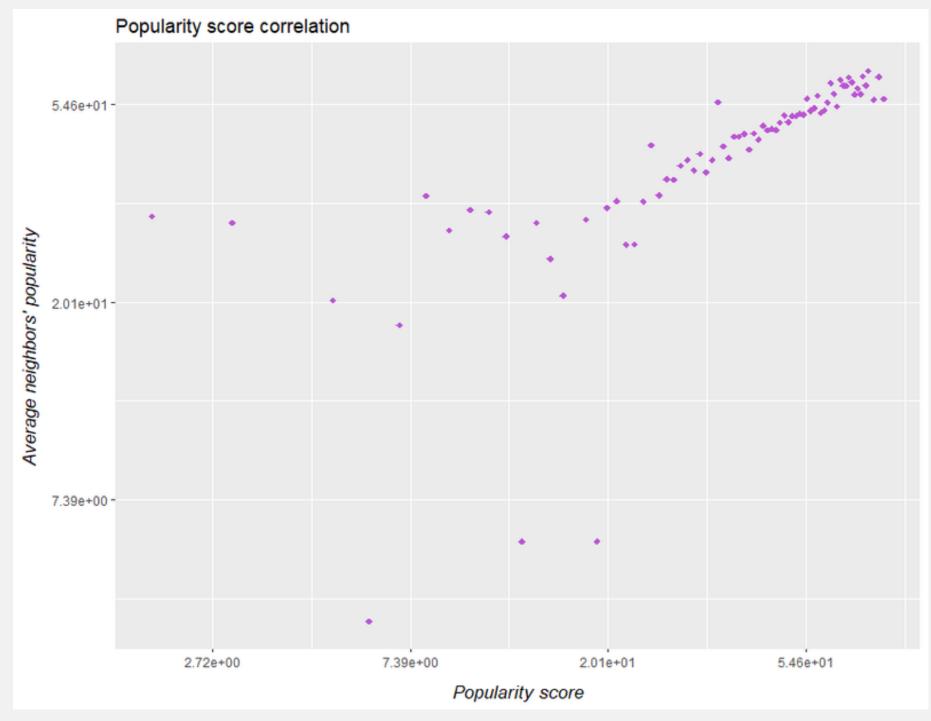
|       | Rap  | Рор  | Indie | Alt  |
|-------|------|------|-------|------|
| Rap   | 0    | 0.69 | 0.7   | 0.9  |
| Рор   | 0.69 | 0    | 0.63  | 0.96 |
| Indie | 0.7  | 0.63 | 0     | 0.76 |
| Alt   | 0.9  | 0.96 | 0.76  | 0    |

## **Assortativity:**

• Assortativity (degree): 0.16



#### Assortativity (popularity): 0.44



# <u>Are hubs not necessarily the most popular nodes?</u>

- Let's consider as hubs the nodes with a degree higher than the 95th percentile of the degree distribution
- 36 hubs with k > 34
- 95th percentile of the popularity scores distribution: 66
- Hubs average popularity score: 60
- 60% percent of the hubs have a popularity score lower than 66
- Furthermore, only 36% of the hubs would also be hubs by followers count

#### Then, who are the hubs?

- Either very famous and relevant artists...
- ...or producers (which of course get a lot of features) and rap artists with very long careers, but which are not as relevant today

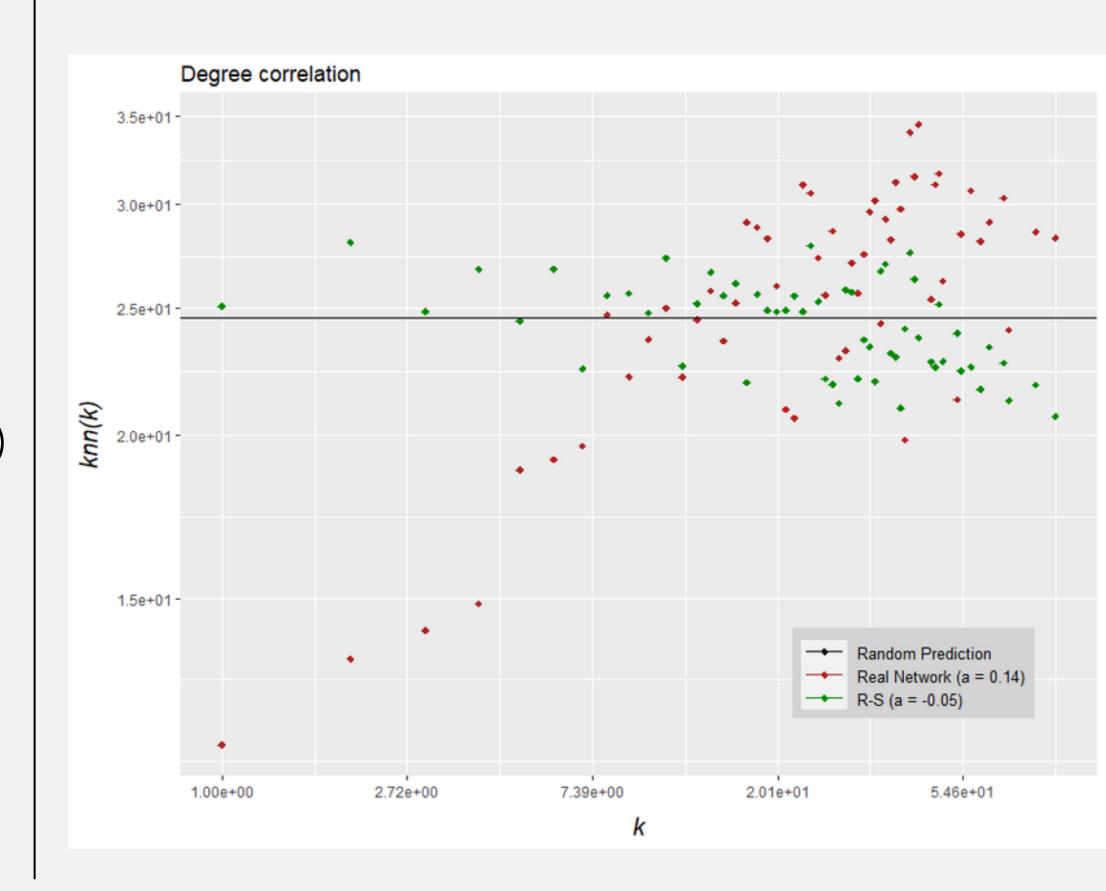
## Is the assortativity structural?

We can address this by rewiring the network while preserving the degree distribution

- Randomization with Simple Links (R-S)
- Randomization with Multiple Links (R-M)

#### **RESULTS:**

- Assortativity (R-S) = -0.06
- Assortativity (R-M) = -0.05



### <u>Assortativity in genre sub-networks:</u>

|       | Degree | Degree<br>(R-S) | Degree<br>(R-M) | Popularity |
|-------|--------|-----------------|-----------------|------------|
| Rap   | 0.08   | -0.09           | -0.07           | 0.41       |
| Рор   | -0.14  | -0.1            | -0.07           | 0.16       |
| Indie | 0.01   | -0.04           | -0.02           | 0.3        |
| Alt   | -0.16  | -0.14           | -0.06           | 0.43       |

## There are some differences from the original network:

- While all the sub-networks are assortative by popularity...
- ...the indie network is neutral by degree
- The pop and alt networks are disassortative by degree
- They also seem to be structurally disassortative, but the alt's network very low number of edges makes making assumptions difficult

