Analysis of anime voice actor's social network and popularity

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Introduction

Our research went through multiple stages. Starting with Linked Open Data, moving to Social Network Analysis and ending with applied machine learning.

Thus the order of this presentation will be chronological.

Nonetheless our main focus is: *Social network of seiyuu* (or anime's voice actors)

Why seiyuu?

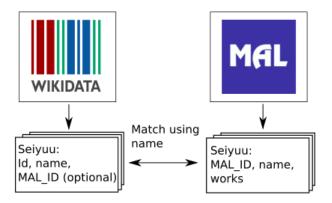
- Because I really like anime and manga.
- There are many researches whose focus is actor's social network but usually is hollywood actors and not only voice actors. Seiyuu and anime industry is really unusual and so could present a different structure.
- There're several database with information about anime and seiyuu but either it's incomplete or doesn't have a good structure nor format.

Wikidata and MyAnimeList

We wanted to use Wikidata as our source but it's too incomplete; it doesn't have information about works of seiyuu.

Instead we used MyAnimeList (MAL) through an API called Jikan; retrieving data in JSON and then changing its format to RDF.

We used Wikidata to get the list of seiyuu and MyAnimeList to get list of works for each seiyuu and information about anime.



- Total of 6472 seiyuu on Wikidata
- Only 59 had MAL_IDs
- 3033 MAL_IDs retrieved
- At the end having 3092 seiyuu with MAL_ID
- 2956 of which had at least one work



Data retrieved

All in all we were able to retrieve the following information for 2956 seiyuu and 7614 anime.

- For Seiyuu:
 - Name
 - Debut (this was obtained from oldest work's aired date)
 - Gender
 - Popularity (member_favorites information of MAL)
 - Works (anime roles with anime information plus wheter is a main role or not)
- For Works (Anime):
 - Year that began airing
 - Favorites
 - Score (from 0 to 10, MAL user based)
 - Popularity (ranking over all MAL animes)
 - Members (how many MAL users have it on their list)
 - Genres



Social Network

This social network is of a particular kind called *two-mode networks* which consists of a set of actors (seiyuu) and events (anime).

Details to consider:

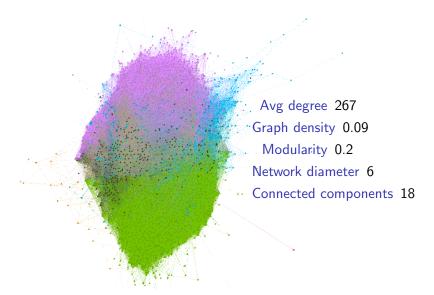
- We can choose between anime and seiyuu as nodes.
- Nodes are time dependant (since they have debut year).
- Edge or relationship definition:
 - How many works in common?
 - Which time frame?

We compared two graph definitions using *seiyuu as nodes* and, as edge definition:

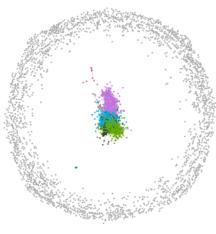
- at least 1 work in common
- at least 10 works in common

Both of them during the time frame between the first debut registered (1960) and the year of observation.

One work in common



Ten works in common



Avg degree 9
Graph density 0.003
Modularity 0.29
Network diameter 7
Connected components 2261

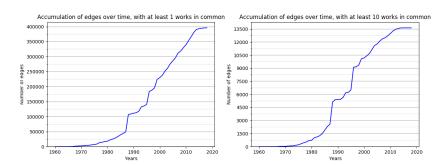
Features

Strongly connected With merely $\sim\!3000$ nodes it has $\sim\!400000$ edges when only one work in common is required and $\sim\!14000$ edges when asking for 10 or more.

Big cluster Thightly interconnected and big cluster surrounded by poorly or not connected nodes. (99% of the nodes of one work in common graph and 23% of 10 works in common).

Communities We can see at least four clear communities in each graph.

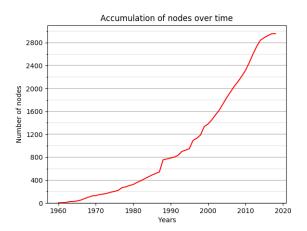
Edge growth



• Edge growth follows the same distribution with 1 and 10 works in common



Node growth



 More than half of the nodes are from last 18 years (2000 to 2018)



Top 5 degree

| Name | Degree |
|------------------|--------|
| Takehito Koyasu | 1545 |
| Akira Ishida | 1488 |
| Mamiko Noto | 1422 |
| Nobuo Tobita | 1417 |
| Daisuke Namikawa | 1390 |

Table: One work in common

| Degree | | |
|--------|--|--|
| 311 | | |
| 273 | | |
| 258 | | |
| 232 | | |
| 229 | | |
| | | |

Table: Ten works in common



Top 5 betweenness centrality

| Name | BtwC | Name | BtwC | |
|------------------|----------|------------------|----------|--|
| Takehito Koyasu | 49982.52 | Takehito Koyasu | 18489.44 | |
| Akira Ishida | 40221.50 | Mamiko Noto | 10988.96 | |
| Daisuke Namikawa | 30448.43 | Daisuke Namikawa | 9570.48 | |
| Nobuo Tobita | 29363.25 | Akira Ishida | 8299.19 | |
| Mamiko Noto | 29168.18 | Rie Kugimiya | 7560.16 | |

Table: One work in common

Table: Ten works in common



Conclusion

SON PARECIDAS, BLA BLA, NUESTRA DEFINICION QUEDA DE AHORA EN MAS:

Node Seiyuu

Edge At least 10 works in common from 1960 to year of observation.

Popularity: Definition

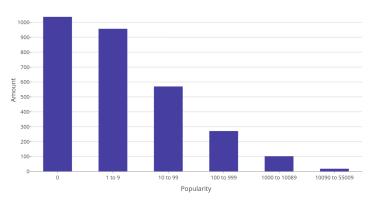
Since we are using MAL database and it has a social component, seems logic to use *member_favorites* as a representation of *popularity*. We can also get popularity and score of anime from opinions of the same set of users.

| Name | Popularity | Some popular roles of them |
|------------------|------------|--------------------------------------|
| Kana Hanazawa | 56637 | Angel Beats!: Tachibana, Kanade |
| Hiroshi Kamiya | 49685 | Shingeki no Kyojin: Levi, |
| Mamoru Miyano | 43942 | Death Note: Yagami, Light |
| Rie Kugimiya | 31668 | Fullmetal Alchemist: Elric, Alphonse |
| Jun Fukuyama | 26811 | Ao no Exorcist: Okumura, Yukio |
| Miyuki Sawashiro | 26501 | Durarara!!: Sturluson, Celty |
| Tomokazu Sugita | 24449 | Gintama: Sakata, Gintoki |
| Daisuke Ono | 24080 | Durarara!!: Heiwajima, Shizuo |
| Saori Hayami | 18322 | Owari no Seraph: Hiiragi, Shinoa |
| Aya Hirano | 18094 | Fairy Tail: Heartfilia, Lucy |



Popularity: Analysis





Total: 2956

Mean: 289.55

Median: 2.0

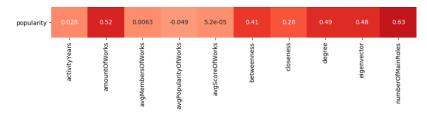
Min: 0; Max: 55018

• 1037 values equal to zero

• Only 120 values bigger than 1000



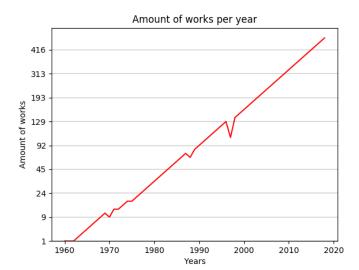
Popularity: Pearson correlation



- Big correlation between popularity and amount of works.
- Number of main roles and amount of works have a strong correlation with each other (0.9) but they have different influence over popularity, this means they provide distinct information.

Since our dataset is biased in favor of more modern anime we thought of correlate with *recent works* only.

But, how recent? Last 5, 10 or 20 years?





ENTONCES LA DEFINICION DE RECENT WORKS ES BLA

| popularity - | 0.028 | 0.63 | 0.52 | 0.04 | 0.024 | 0.08 | 0.41 | 0.28 | 0.49 | 0.48 | 0.75 |
|--------------|-----------------|-------------------------------------|-----------------|---------------------------|------------------------------|-------------------------|---------------|------------|----------|---------------|-----------------------------------|
| | activityYears - | amountOfRecentWorks(last 9 years) - | amountOfWorks - | avgMembersOfRecentWorks - | avgPopularityOfRecentWorks - | avgScoreOfRecentWorks - | betweenness - | doseness - | degree - | eigenvector - | numberOfMainRoles(last 9 years) - |

 TODO AGREGAR DATOS ACA COMO QUE RECENT WORKS ES MAS IMPORTANTE, BLA

EL HECHO DE QUE TRATAMOS DE EXPLICAR POR QUE? O MEJOR NO?

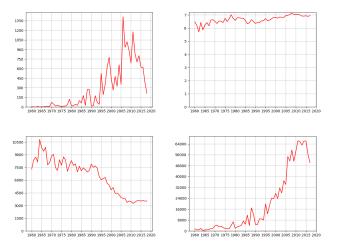


Figure: Averages of favorites, score, popularity and amount of members.



popularity

conclusion