# Recomendação de filmes

# Problema Proposto

Selecionar itens personalizados com base em:

- Interesse dos usuários
- Contexto de cada usuário

# DataSet MovieLens

# Movies e Ratings

#### ratings

| userId | movield | rating | timestamp |
|--------|---------|--------|-----------|
| 1      | 1       | 4.0    | 964982703 |
| 1      | 3       | 4.0    | 964981247 |
| 1      | 6       | 4.0    | 964982224 |
| 1      | 47      | 5.0    | 964983815 |
| 1      | 50      | 5.0    | 964982931 |
| 1      | 70      | 3.0    | 964982400 |
| 1      | 101     | 5.0    | 964980868 |
| 1      | 110     | 4.0    | 964982176 |
| 1      | 151     | 5.0    | 964984041 |
| 1      | 157     | 5.0    | 964984100 |
| 1      | 163     | 5.0    | 964983650 |
| 1      | 216     | 5.0    | 964981208 |
|        |         |        |           |

#### movies

| movield | title                                 | genres                                      |
|---------|---------------------------------------|---|
| 1       | Toy Story (1995)                      | Adventure Animation Children Comedy Fantasy |
| 2       | Jumanji (1995)                        | Adventure Children Fantasy                  |
| 3       | Grumpier Old Men (1995)               | Comedy Romance                              |
| 4       | Waiting to Exhale (1995)              | Comedy Drama Romance                        |
| 5       | Father of the Bride Part II (1995)    | Comedy                                      |
| 6       | Heat (1995)                           | Action Crime Thriller                       |
| 7       | Sabrina (1995)                        | Comedy Romance                              |
| 8       | Tom and Huck (1995)                   | Adventure Children                          |
| 9       | Sudden Death (1995)                   | Action                                      |
| 10      | GoldenEye (1995)                      | Action Adventure Thriller                   |
| 11      | American President, The (1995)        | Comedy Drama Romance                        |
| 12      | Dracula: Dead and Loving It (1995)    | Comedy Horror                               |
| 13      | Balto (1995)                          | Adventure Animation Children                |
| 14      | Nixon (1995)                          | Drama                                       |
| 15      | Cutthroat Island (1995)               | Action Adventure Romance                    |
| 16      | Casino (1995)                         | Crime Drama                                 |
| 17      | Sense and Sensibility (1995)          | Drama Romance                               |
| 18      | Four Rooms (1995)                     | Comedy                                      |
| 19      | Ace Ventura: When Nature Calls (1995) | Comedy                                      |
| 20      | Money Train (1995)                    | Action Comedy Crime Drama Thriller          |
| 21      | Get Shorty (1995)                     | Comedy Crime Thriller                       |
| 22      | Copycat (1995)                        | Crime Drama Horror Mystery Thriller         |

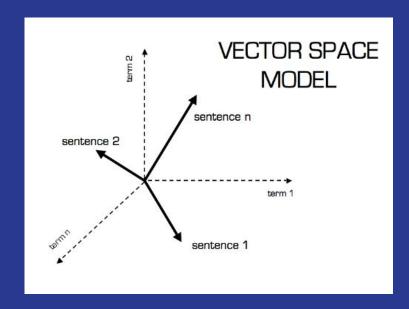
### Técnicas

# de Resolução

### Baseado

### em conteúdo

- Similaridade entre filmes
- Cosseno



Retirado de <a href="https://bit.ly/2TrYco3">https://bit.ly/2TrYco3</a>

#Testando a validade do recomendador com sequels
print(genre\_recommendations('Free Willy (1993)').head(5)) #aventura, infantil, drama
print(genre\_recommendations('Free Willy 2: The Adventure Home (1995)').head(5)) #aventura, infantil, drama



```
Black Beauty (1994)
365
396
                                     Free Willy (1993)
498
                                          Andre (1994)
        Homeward Bound: The Incredible Journey (1993)
773
1170
                                          Buddy (1997)
Name: title, dtype: object
365
                                   Black Beauty (1994)
396
                                     Free Willy (1993)
498
                                          Andre (1994)
773
        Homeward Bound: The Incredible Journey (1993)
1170
                                          Buddy (1997)
Name: title, dtype: object
```

```
print(genre_recommendations('Shining, The (1980)').head(5)) #terror
print(genre_recommendations('Paranormal Activity 3 (2011)').head(5)) #terror
```

Castle Freak (1995) 188 593 Cemetery Man (Dellamorte Dellamore) (1994) 653 Eyes Without a Face (Yeux sans visage, Les) (1... Children of the Corn IV: The Gathering (1996) 842 857 Fog. The (1980) Name: title, dtype: object Castle Freak (1995) 188 593 Cemetery Man (Dellamorte Dellamore) (1994) Eyes Without a Face (Yeux sans visage, Les) (1... 653 842 Children of the Corn IV: The Gathering (1996) 857 Fog, The (1980) Name: title, dtype: object







# Fatorização Matricial

### Contexto

#### **Netflix Universe**



Ana



Betty



Carlos



Dana



Movie 1



Movie 2



Movie 3



Movie 4



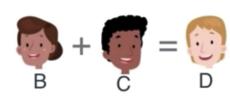
Movie 5

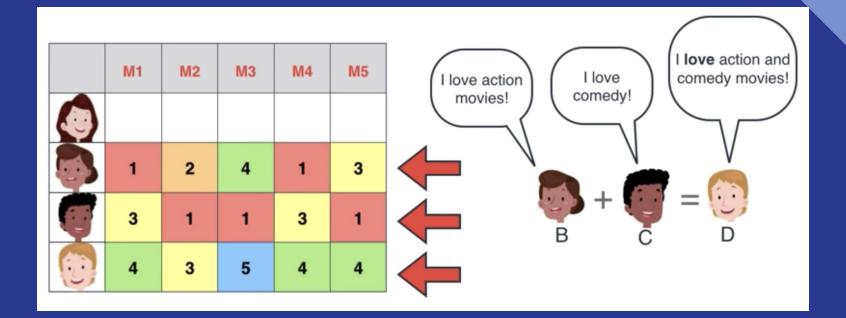
|                              | M<br>1 | M<br>2 | M<br>3 | M<br>4 | M<br>5 |
|------------------------------|--------|--------|--------|--------|--------|
| 4                            | 3      | 1      | 1      | 3      | 1      |
|                              | 1      | 2      | 4      | 1      | 3      |
| a distribution of the second | 3      | 1      | 1      | 3      | 1      |
|                              | 4      | 3      | 5      | 4      | 4      |

## Informações

|     | M1 | M2 | МЗ | M4 | M5 |
|-----|----|----|----|----|----|
| 4   |    |    |    |    |    |
| 4   | 1  | 2  | 4  | 1  | 3  |
|     | 3  | 1  | 1  | 3  | 1  |
| (1) | 4  | 3  | 5  | 4  | 4  |









## Objetivo

## Matrix Factorization

|        | M1 | M2 | МЗ | M4 | M5 |
|--------|----|----|----|----|----|
| Comedy | 3  | 1  | 1  | 3  | 1  |
| Action | 1  | 2  | 4  | 1  | 3  |

|     | Comedy   | Action   |
|-----|----------|----------|
| A A | <b>②</b> | 8        |
| B   | 8        |          |
|     | <b>②</b> | 8        |
| D   | <b>②</b> | <b>(</b> |

|   | M1 | M2 | МЗ | M4 | M5 |
|---|----|----|----|----|----|
| 4 | 3  | 1  | 1  | 3  | 1  |
| 4 | 1  | 2  | 4  | 1  | 3  |
|   | 3  | 1  | 1  | 3  | 1  |
| 0 | 4  | 3  | 5  | 4  | 4  |

### Vida Real

|   | M1 | M2 | M3 | M4 | M5 |
|---|----|----|----|----|----|
|   | 3  |    | 1  |    | 1  |
| В | 1  |    | 4  | 1  |    |
| C | 3  | 1  |    | 3  | 1  |
| D |    | 3  |    | 4  | 4  |

# Objetivo

|    | M1 | M2 | МЗ | M4 | M5 |
|----|----|----|----|----|----|
| F1 | 3  | 1  | 1  | 3  | 1  |
| F2 | 1  | 2  | 4  | 1  | 3  |

|     | F1 | F2 |
|-----|----|----|
| (a) | 1  | 0  |
| B   | 0  | 1  |
| C   | 1  | 0  |
| D   | 1  | 1  |

|   | M1 | M2 | M3 | M4 | M5 |
|---|----|----|----|----|----|
|   | 3  |    | 1  |    | 1  |
| B | 1  |    | 4  | 1  |    |
| C | 3  | 1  |    | 3  | 1  |
| D |    | 3  |    | 4  | 4  |

# Predição

|    | M1 | M2 | МЗ | M4 | M5 |
|----|----|----|----|----|----|
| F1 | 3  | 1  | 1  | 3  | 1  |
| F2 | 1  | 2  | 4  | 1  | 3  |

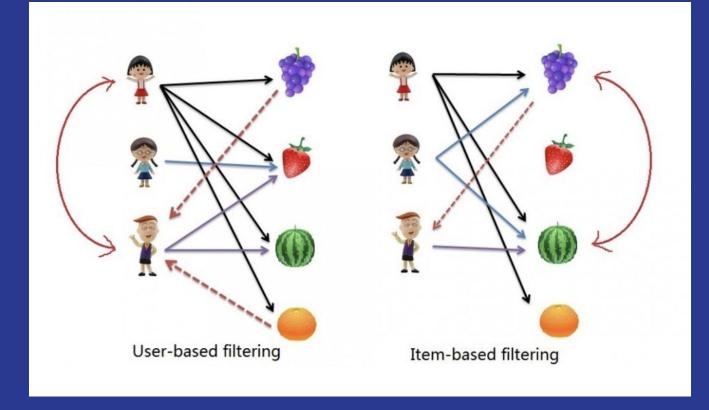
|     | F1 | F2 |  |
|-----|----|----|--|
| (a) | 1  | 0  |  |
| B   | 0  | 1  |  |
| C   | 1  | 0  |  |
| D   | 1  | 1  |  |

|   | M1 | M2 | M3 | M4 | M5 |
|---|----|----|----|----|----|
|   | 3  | 1  | 1  | 3  | 1  |
| B | 1  | 2  | 4  | 1  | 3  |
| C | 3  | 1  | 1  | 3  | 1  |
| D | 4  | 3  | 5  | 4  | 4  |

# Filtragem Colaborativa

- Tipos: Filtragem por item ou usuário
- Correlação entre itens
- Predição da avaliação

## Esquema



# Regressão Linear

- Seleção das características que irão basear a avaliação
- Prever a avaliação de um usuário sobre os filmes

Agradecemos a atenção!