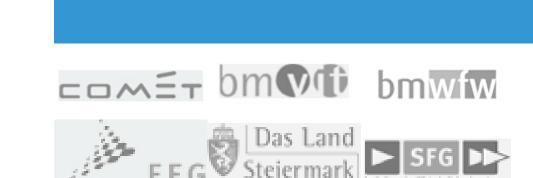
# VIZREC: A TWO-STAGE RECOMMENDER SYSTEM FOR PERSONALIZED VISUALIZATIONS

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# **Research Question**

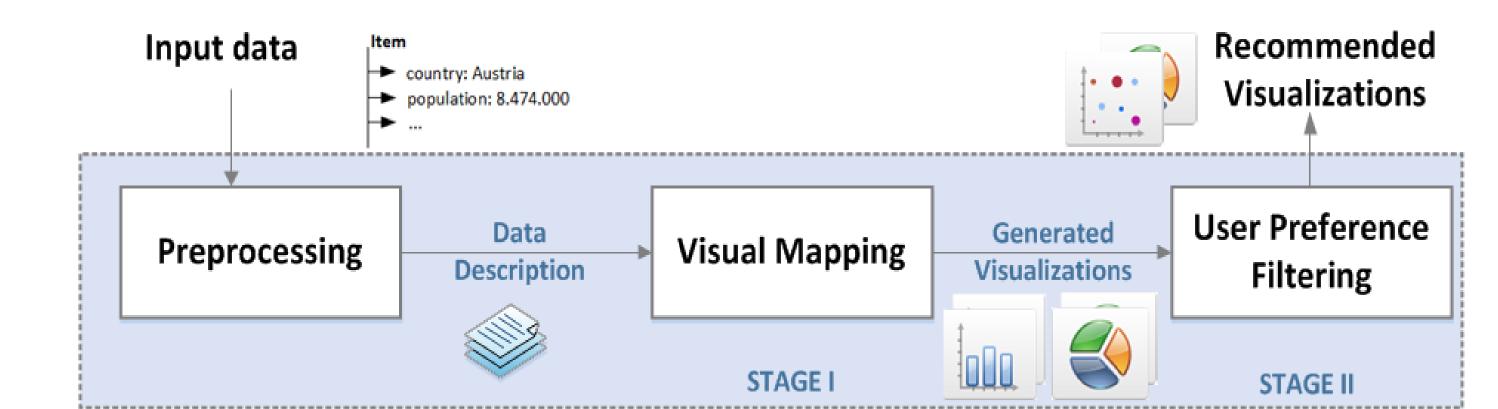
Shall **visualizations** be **recommended** in a **personalized** manner?

## CONTRIBUTIONS

For dealing with an overloaded information space, we propose *VizRec*, a novel approach **combining recommender systems (RS)** and **visualizations**. Our **contributions** are:

# Approach

*VizRec* (i) automatically identifies a set of appropriate visualizations using a rule-based algorithm, (ii) filters a subset of the appropriate visualizations based on the users preferences and (iii) displays them to the user in a personalized manner.



- a novel visual recommender approach to generating and recommending personalized visualizations according to user preferences,
- a crowd-based experiment employing Amazon Mechanical Turk to collect user preferences showing the usefulness of the approach.

## EXPERIMENT

We conducted a crowd-based experiment using **Amazon Mechanical Turk** to obtain user preferences. The experiment setup was the following:

- MovieLens dataset as input data,
- 55 mapping combinations for the input data: 32 bar-charts, 9 line-charts, 13 timelines and 1 geo-chart,

Fig. 2: *VizRec* workflow for recommending personalized visualizations

## RESULTS

#### • User Preferences:

- a total of 550 ratings were collected,
- from 36 expert workers in Amazon Mechanical Turk.

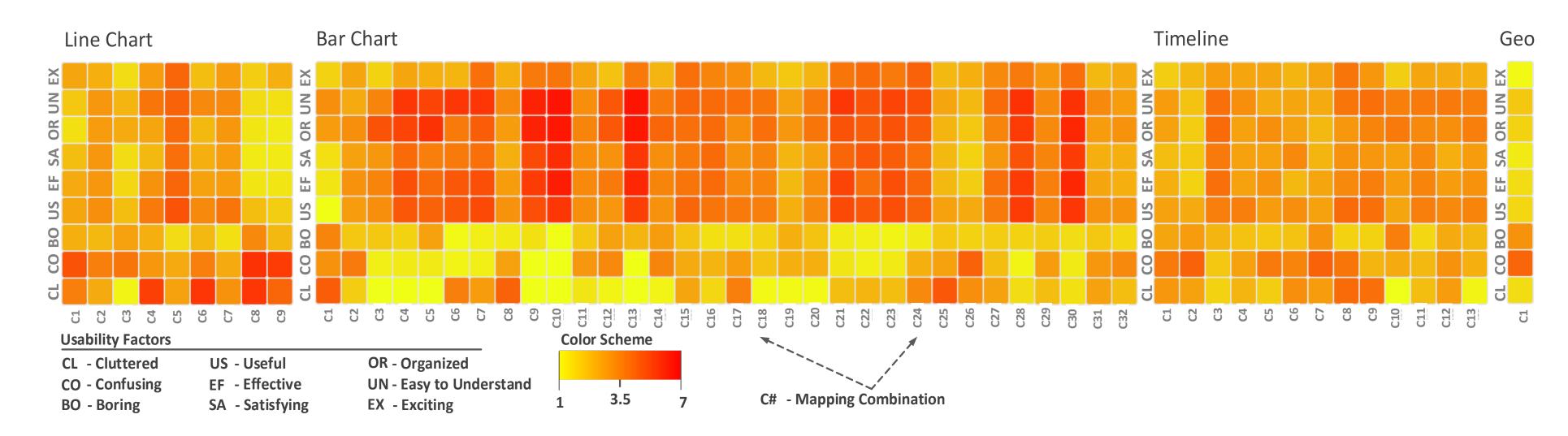
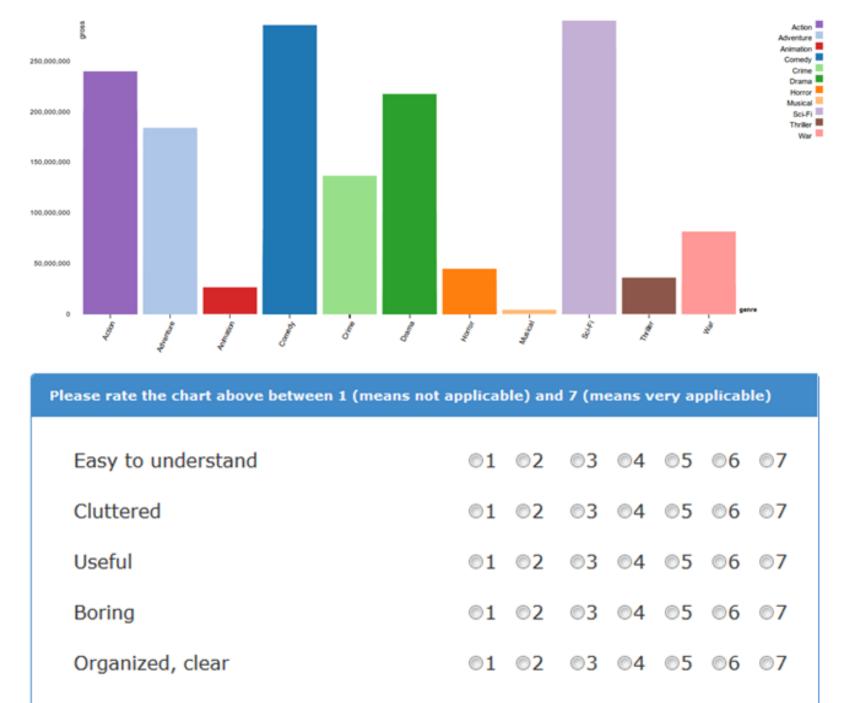
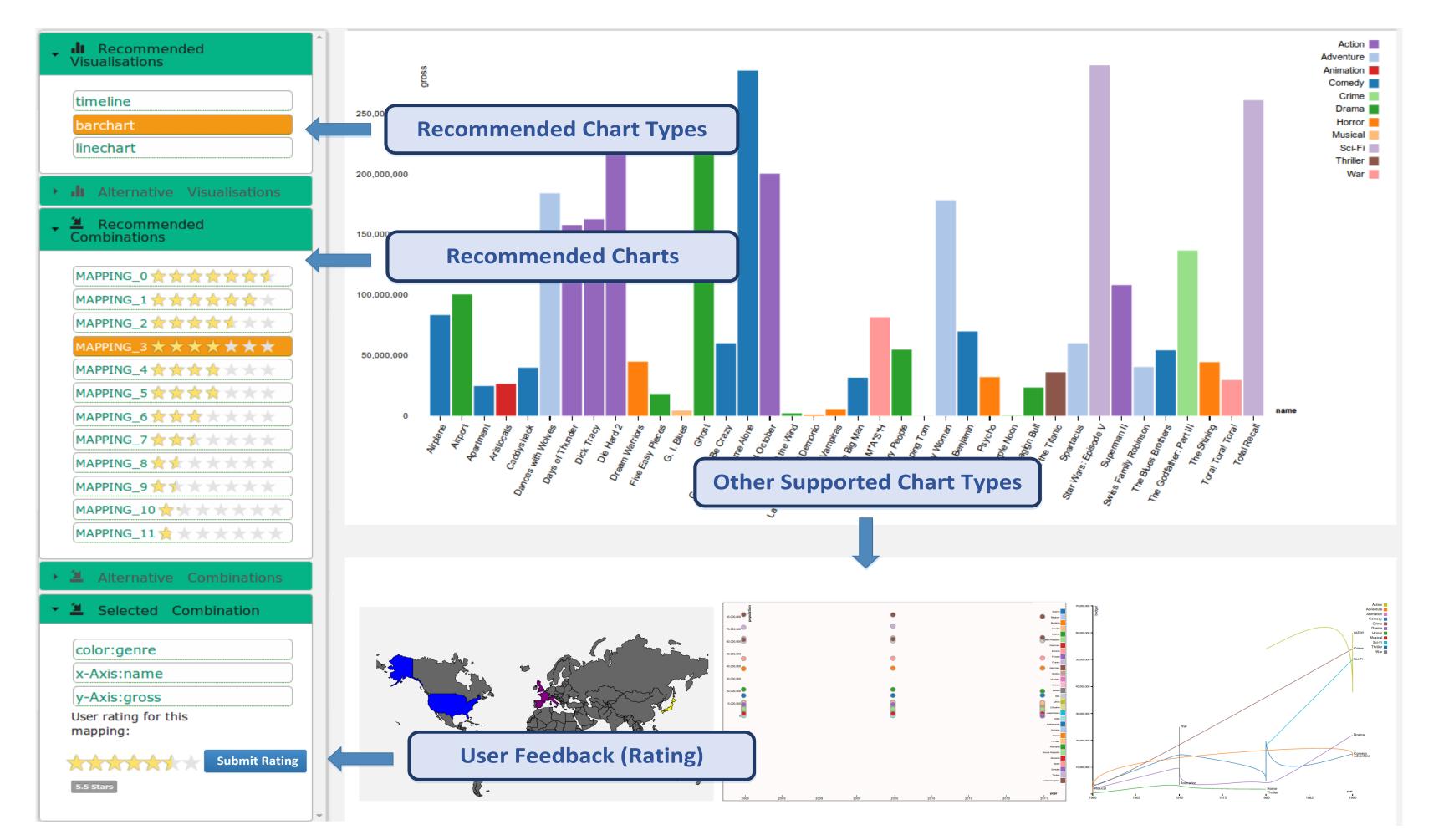


Fig. 3: Average of explicit ratings for 9 usability factors

- 19 HITs, each evaluated by 10 users in terms of quality of the suggested visualizations along 9 usability factors,
- the rating scale: between 1 (not applicable) and 7 (very applicable).



- Visual Recommendations:
  - a subset of appropriate visualizations selected according to user preferences,
  - recommendations presented in a top-n sorted manner,
  - user feedback given in the form of ratings to update the user preferences.



Exciting, interesting	©1	⊚2	⊚3	⊚4	⊚5	©6	©7
Effective	<b>01</b>	⊚2	⊚3	⊚4	⊚5	©6	⊚7
Satisfying	<b>1</b>	⊚2	⊚3	⊚4	⊚5	©6	⊚7
Confusing	<b>1</b>	©2	⊚3	⊚4	⊚5	©6	⊚7

**Fig. 1:** Example of a HIT (Human Intelligence Task)

#### Fig. 4: Example of a visualization recommendation

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