

Recommending without short head

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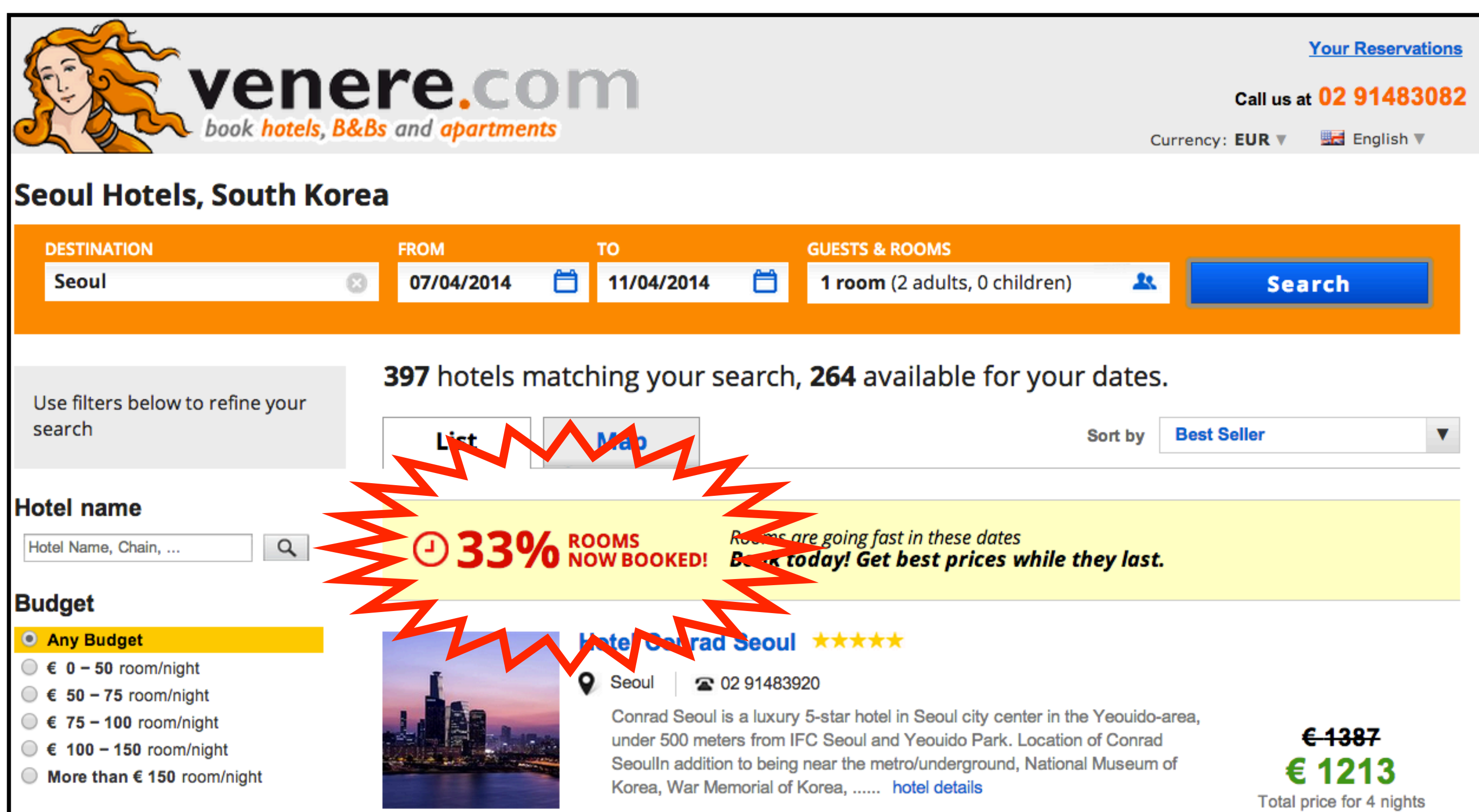
THE PROBLEM

1

Recommender Systems (RSs) tend to enforce the popularity of already popular products (*short-head*).

They often assume an *unlimited* capacity of the products in the catalog and are often trained on *popularity-biased datasets*.

How RSs behave when the most appealing products become unavailable?



Focus of our research: E-tourism domain
(hotels are subject to change their availability over time)

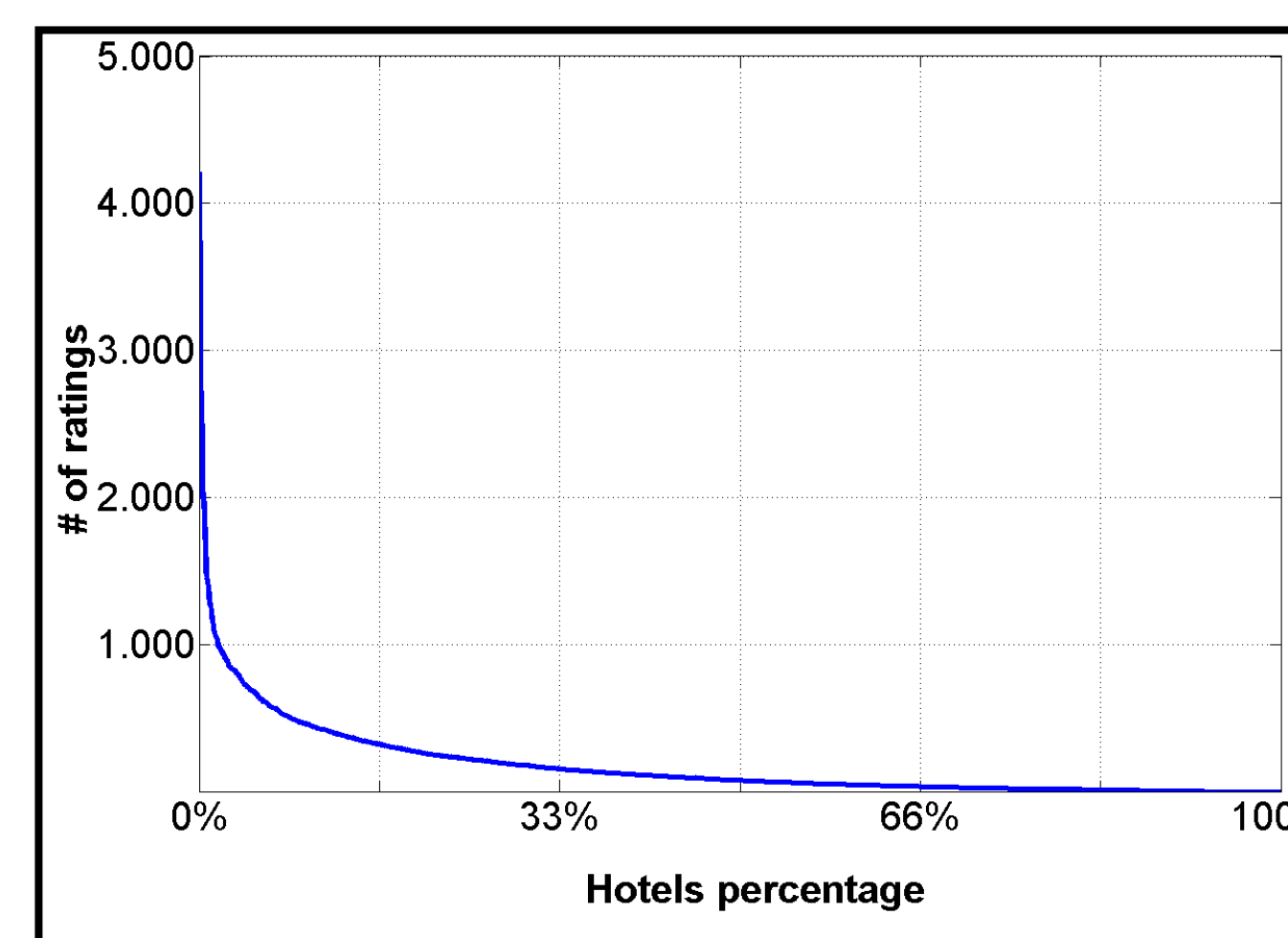
MODELING AVAILABILITY

2

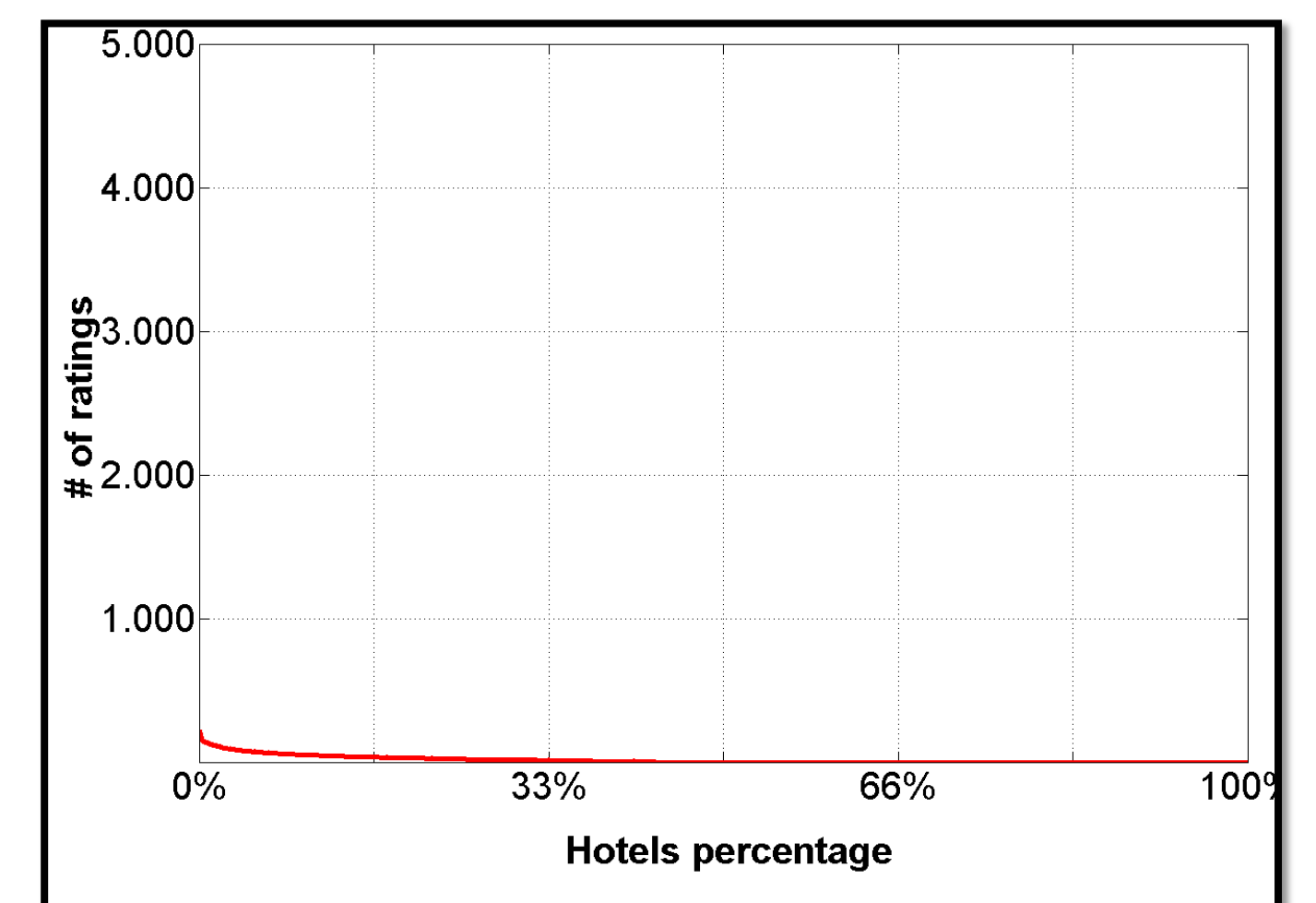
Users tend to book “**best**” hotels first - both the **most popular** and the **best rated** ones

- In *low season* most of the hotels are available (full availability)
- In *high season* the best hotels are gone (bounded availability)

Low season



High season



To select the best hotels in the catalog, both popularity n_i and average rating μ_i should be taken into account. We ranked the hotels according to the *shrank rating*:

$$r_i = \frac{\mu_i n_i + k n_i}{n_i + k}$$

- $k \rightarrow 0$ hotels are ranked by average rating
- $k \rightarrow \infty$ hotels are ranked by popularity

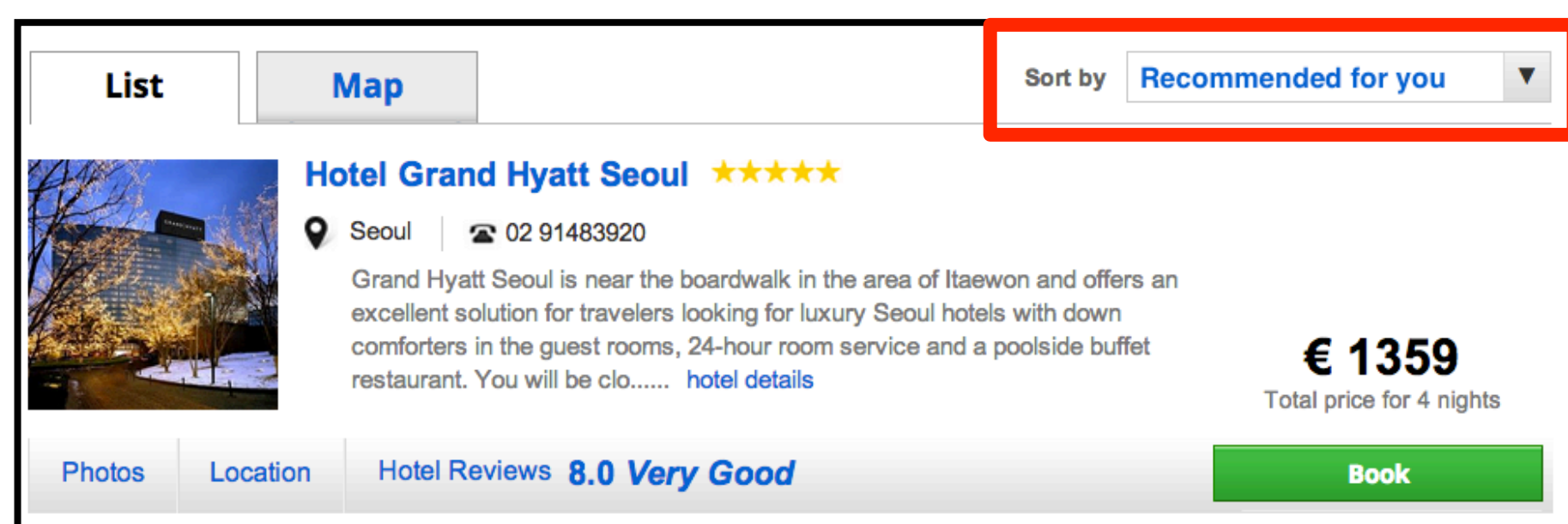
In our experiments we set $k = 10$ and simulated an occupancy of 50% in high season.

USER STUDY

3

Experimental setup:

- *PoliVenus*, a full sized simulation of **Venere.com** (except payment)
- Added both non-personalized and personalized recommendations
- **3k** hotels, **210k** user reviews (Venere + TripAdvisor)
- **382** participants aged between 20 and 40



Recommendation quality:

- *Subjective variables*, (e.g., *satisfaction*) measured using a web based questionnaire based on ResQue model
- *Objective variables*, such as *average cost per night* and *average task execution time*, measured using interaction log data

6 Experimental conditions:

Availability

Low season

High season

Algorithms

Editorial

Popular

Hybrid

Baseline
non-personalized

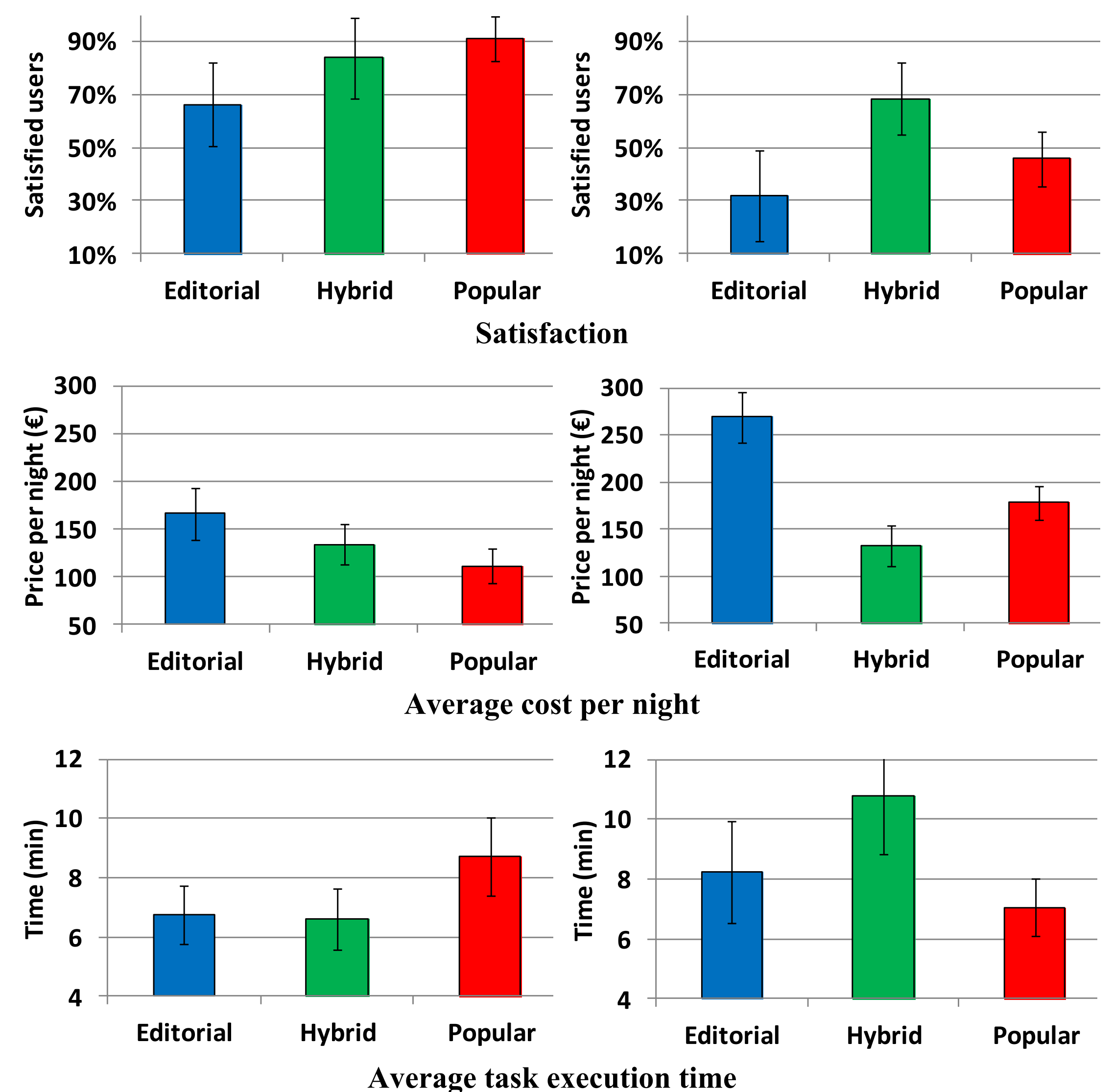
PureSVD +
ContentBased

RESULTS

4

Low season

High season

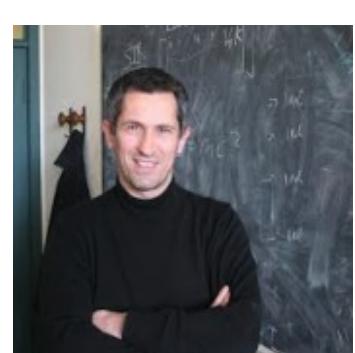


Effects of product consumption and unavailability of short head items:

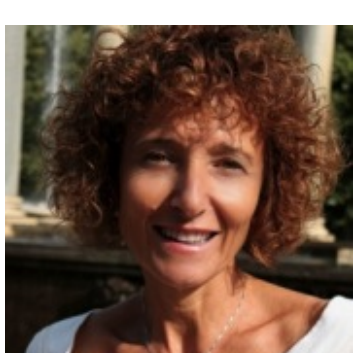
- Weakening of the performance of popularity based recommenders
- Enforcing the benefits of personalized recommendations

CONTACTS

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