INTRODUCING SURPRISE AND OPPOSITION BY DESIGN IN RECOMMENDER SYSTEMS



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BACKGROUND

- Iong tradition of accuracy-based focus in research on recommender systems
- novel qualities beyond pure accuracy:
 - □ e.g., diversity, novelty, serendipity, discovery, unexpectedness,...
 - $\hfill\square$ focus of this work: surprise and opposition
- particularly fields of applications:
 - $\hfill\square$ several recommendations in the row and
 - $\hfill\square$ items to be recommended are intended to entertain the user
 - e.g., videos, jokes, music

STARTING POINT FOR RECOMMENDER SYSTEMS RESEARCH IS TYPICALLY

old approach: sys	stem has to i	dentify and	suggest	items	that
match the user's	preferences	and/or inte	rests		

• challenge: always the same... not desired... boring...

new approach: system has to identify and suggest items that both

- match the user's preferences and/or interests &&
- still are outside the user's typical comfort zone
- challenge: difficult to find the right balance between inside and outside comfort zone, such that the user perceives the recommendations as a surprise or opposition and does not perceive the suggested item a result of a poor quality recommender system

\rightarrow novel approach



NOVEL APPROACH

- a user's perception can be triggered ("designed"), by leveraging the connections or transitions between consecutively recommended items
- \blacksquare \rightarrow purposely create perception of qualities such as surprise or opposition
 - $\hfill\square$ "Surprise by Design"
 - □ "Opposition by Design"

applicability:

□ series of recommendations (i.e., continuous or serial recommendations)

HOW COULD THIS WORK?

some examples:

- □ smooth jazz ballads up-tempo Bebop
 - increasingly higher tempo
 - four smooth jazz ballads, then up-tempo Bebop surprise
- \Box movie star
 - action movies
 - satiric or comedy movies

CONCEPTUAL FOUNDATIONS







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Priming

- implicit, non-conscious memory effect in which the exposure to a stimulus influences the response to another stimulus
- major part of research on priming is based on textual tasks
 - e.g., word-stem completion task



Nudging

- positive reinforcement and indirect suggestions
 → to achieve non-forced compliance
- a nudge = aspect that alters people's behavior in a predictable way without forbidding any options or significantly changing their economic incentives



EXAMPLES FOR PRIMING FOR SURPRISE AND OPPOSITION

depending on what has been played first, an upcoming song may be perceived

- □ surprising because it was not expected to be the next song (or be in the playlist at all) or
- □ the song is quite the opposite from what was expected, so arousing opposition

very trivial examples:

- □ an up-tempo song following a sequence of slow songs
- □ a sequence of songs from one genre and, suddenly, some different genre
- □ a sequence of songs of the same artist, then another artist

□ ...

CHALLENGES FOR PRIMING FOR SURPRISE AND OPPOSITION

creating "good" surprise or opposition is not as trivial as those examples may indicate

surprise is not always a positively connoted surprise

- □ expecting another smooth jazz song instead of a death metal
 - enjoyment of combination?
 - stimulus sufficiently strong for user?
- □ learning effect for user
- □ depending on situation:
 - attentive listening vs. listening during primary task (e.g., work)
 - at work positive surprise; whereas while perceived disturbing while jogging
- □ labeling:
 - in "reggae playlist": a song by Frank Sinatra be surprising, but could be annoying because it does not meet the expectations/acceptance level







EXAMPLES FOR NUDGING FOR SURPRISE AND OPPOSITION

altering a user's music consumption behavior for provided suggestions

making an option a default increases the probability that it is chosen \rightarrow default effect

CHALLENGES FOR NUDGING FOR SURPRISE AND OPPOSITION

default option may be perceived as the "mainstream" option

- □ happily follow the crowd/mainstream (conformity? popularity?)
- avoid it (following the crowd/mainstream may be perceived "uncool")
- contrast between popular song (e.g., rock anthem "We will rock you") and unknown song, only if concepts and relations perceived as such

NUDGING FOR SURPRISE AND OPPOSITION HAS TO ACCOUNT FOR





FUTURE WORK

although priming as well as nudging are rooted in well-established theories \rightarrow transfer to recommender systems open up a new research area

requires holistic approach

- integration of knowledge from various disciplines
 - e.g., computer science, psychology, economics, law
- and perspectives
 - e.g., user, platform provider, music creators, artists, labels
- and methods
 - e.g., experimental user studies, field studies, prediction experiments, etc.

how to prime perceptions "generally" in recommendations

how to prime in specific cases/contexts



TAKE AWAY...

- through priming and nudging →
 - $\hfill\square$ "Surprise by Design"
 - □ "Opposition by Design"



- applicability:
 - □ several items suggested in a row (i.e., continuous or serial recommendations)
 - □ items recommended are intended to entertain the user (e.g., videos, jokes, music)
- complex and requires holistic approach



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