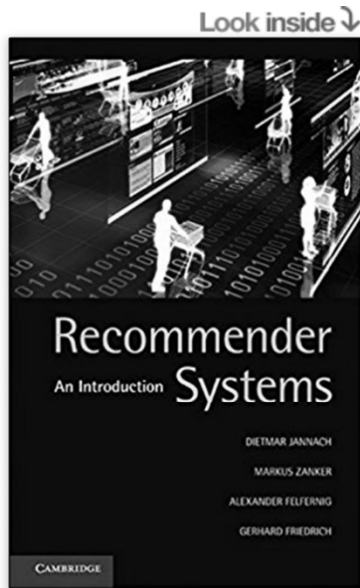


Priporočilni sistemi

- Pregled
- Klasifikacija priporočilnih sistemov
- Organizacija podatkov



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Recommender Systems: An Introduction Hardcover – 25 Nov 2010

by Dietmar Jannach (Author), Markus Zanker (Author), Alexander Felfernig (Author), & 1 more

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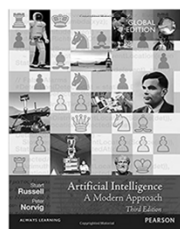
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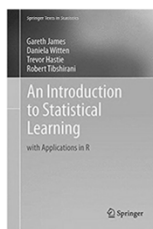
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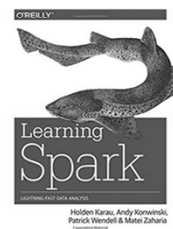
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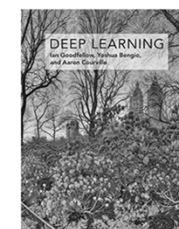
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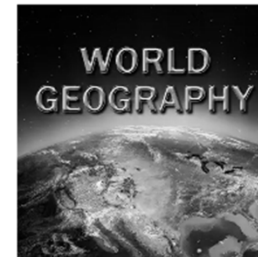
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2020-21 UEFA Champions League, Group Stage



Paris Saint-Germain 1 FT 0 RB Leipzig



- ✓ 15 Danilo Pereira
- ✓ 8 Leandro Paredes
- ✓ 21 Ander Herrera
- ✓ ↑↓ 6 Marco Verratti
- ✓ 10 Neymar
- ✓ ↑↓ 19 Pablo Sarabia
- ✓ 7 Kylian Mbappé
- ✓ ↑↓ 18 Moise Kean
- ✓ 11 Ángel Di María
- ✓ ↑↓ 12 Rafinha

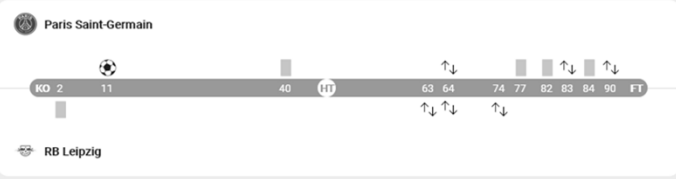
- SUBSTITUTES**
- 30 Alexandre Letellier
 - 20 Layvin Kurzawa
 - 16 Sergio Rico
 - 31 Colin Dagba
 - 32 Timothee Pembele
 - 36 Kays Ruiz-Atil
 - 37 Bandiougou Fadiga

Game Information

VENUE: Parc des Princes

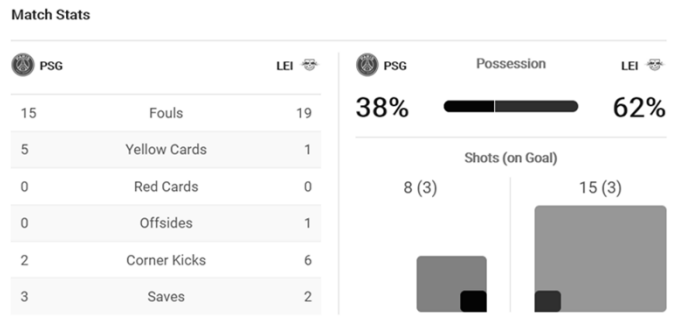
9:00 PM CET, November 24, 2020

11h - Reuters



Match Commentary

- Match ends, Paris Saint Germain 1, RB Leipzig 0.
- Match ends, Paris Saint Germain 1, RB Leipzig 0.
- 90'+6' ⚽ Second Half ends, Paris Saint Germain 1, RB Leipzig 0.



- UEFA Champions League News**
- Ronaldo has last laugh after Ferencvaros player imitates celebration**
Cristiano Ronaldo quickly responds with a goal after Ferencvaros striker Myrto Uzuni imitates his goal celebration.
 - Giroud, Morata deliver to send Chelsea & Juve to UCL last 16**
Olivier Giroud and Alvaro Morata both score dramatic winners to send Chelsea and Juventus to the UCL round of 16.
 - Dest 'showing what he can do' with first Barca goal**
Gab Marcotti says Sergino Dest could become Barcelona's permanent right back if he keeps up his current form.
 - Burley: Scary thing about Haaland is he can still improve**
Gab Marcotti and Craig Burley react to Erling Haaland's latest star showing in Dortmund's 3-0 win over Club Brugge.
 - Bruno Fernandes demonstrates why Manchester United can't afford to do without him**
At some point Bruno Fernandes will need to be given a rest, but as demonstrated vs. Istanbul Basaksehir, Man United can't afford to do without him.
 - Morata 'the only positive' in Juventus win vs. Ferencvaros**
Steve Nicol is not impressed by Juventus' performance in a narrow Champions League win vs. Ferencvaros.

All soccer News

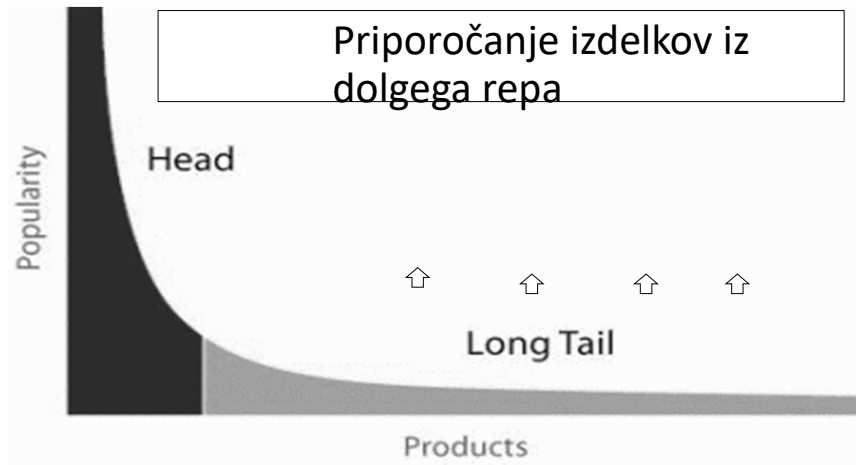
Problem priporočanja

- Priporočilni sistem „uporabnikom“ priporoča „izdelke“
 - Zmanjšuje informacijsko preobremenitev
 - Nudi pomoč pri nakupu (razlaga priporočila)

RS are software agents that elicit the interests and preferences of individual consumers [...] and make recommendations accordingly. They have the potential to support and improve the quality of the decisions consumers make while searching for and selecting products online.

- Različne paradigme
 - Odvisno od razpoložljivih podatkov
 - Odvisno od implicitnih ali eksplicitnih povratnih informacij
 - Odvisno od problema priporočanja

Kdaj priporočilni sistem dobro deluje?



- Priporoča primerne izdelke, ki jih uporabnik še ne pozna
- O uporabniku mora sistem za dobra priporočila vedeti čimveč!
- MovieLens: 20% filmov ima 74% vseh pozitivnih ratingov (nad 3 na skali 1-5)

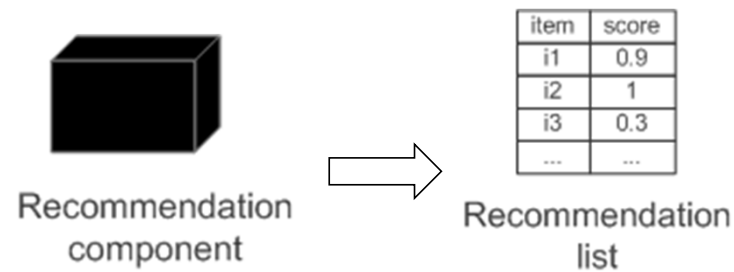
Abstrakcija priporočilnega sistema



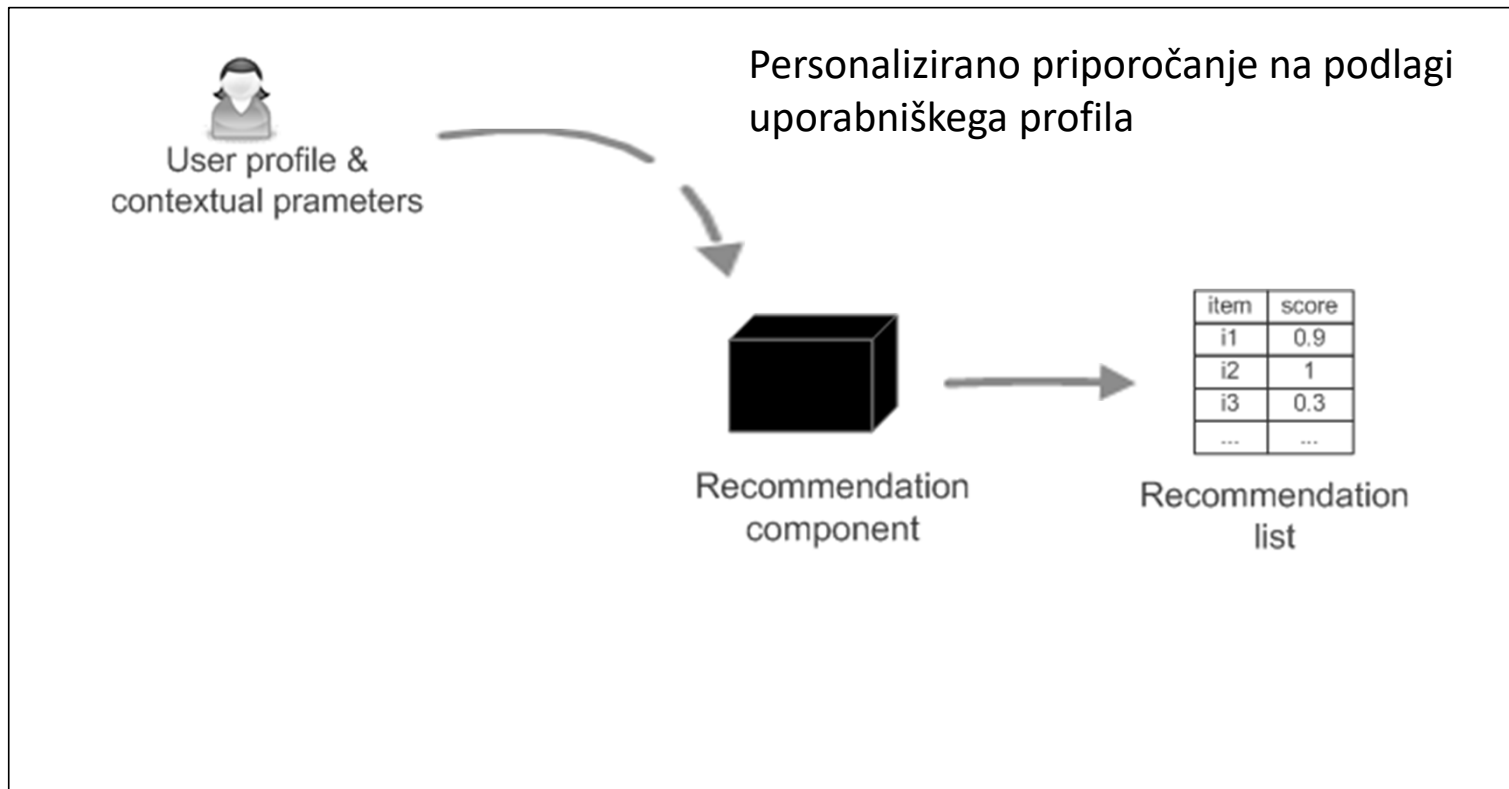
- Priporočilni sistem kot funkcija
- Ob podanem:
 - Modelu uporabnika (preference, profil, demografski podatki, kontekst)
 - Izdelkih (z ali brez opisanih značilnosti)
- Poišči:
 - Relevantnost vsakega izdelka za vsakega uporabnika in jo uporabi za razvrščanje (rating)

Paradigme priporočilnih sistemov

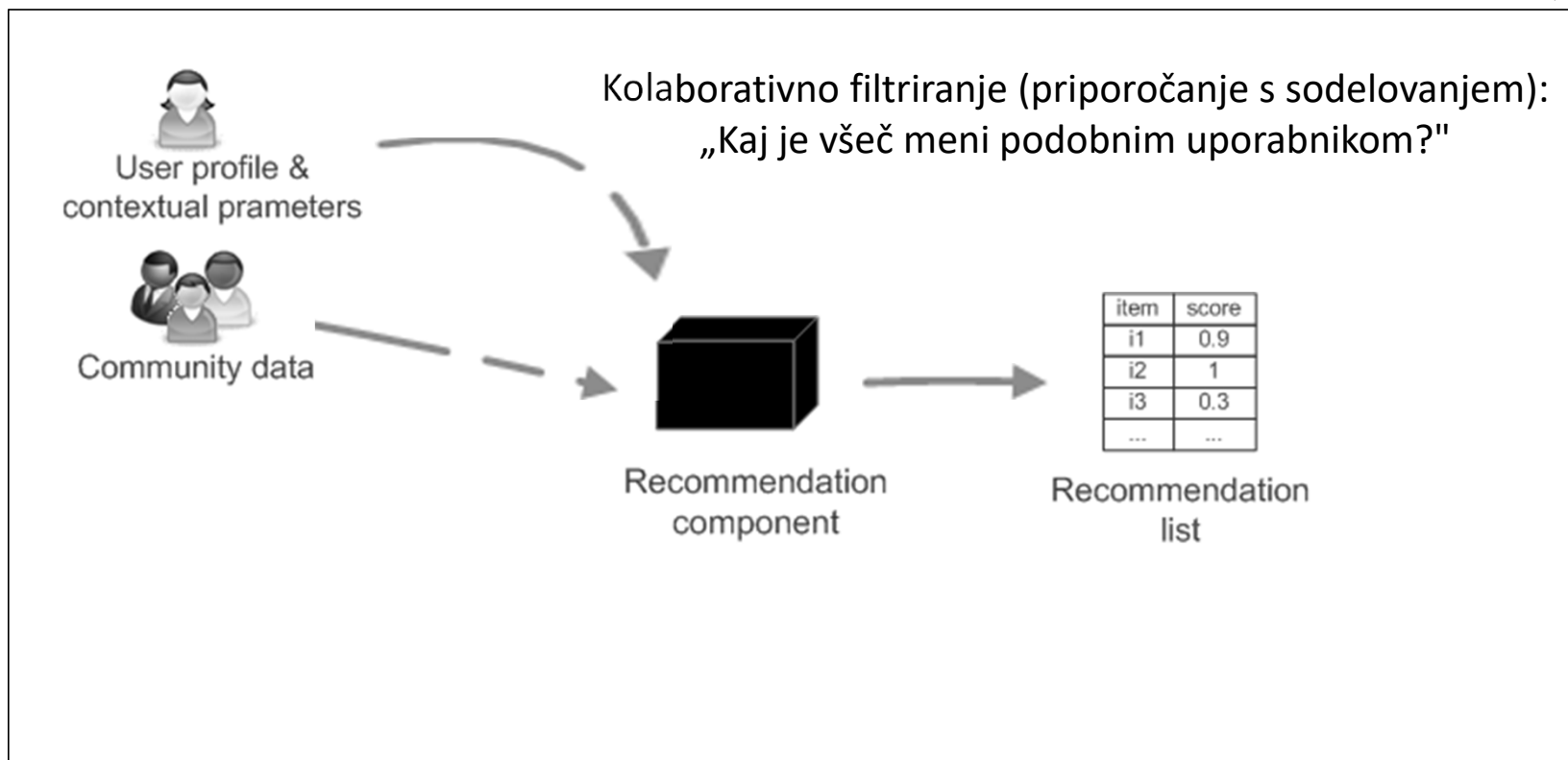
Zmanjševanje informacijske preobremenitve s priporočanjem relevantnih izdelkov. Kako?



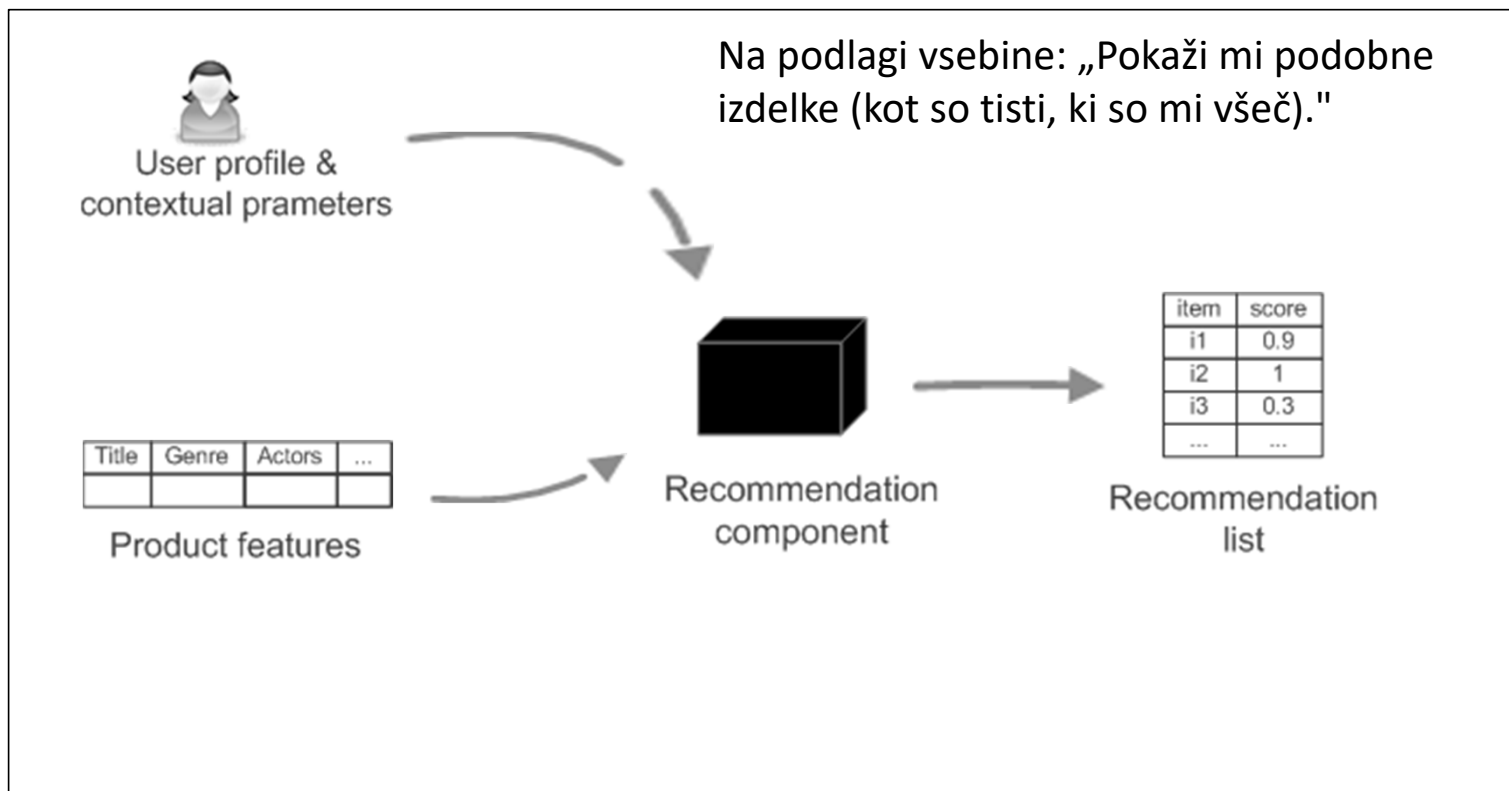
Paradigme priporočilnih sistemov



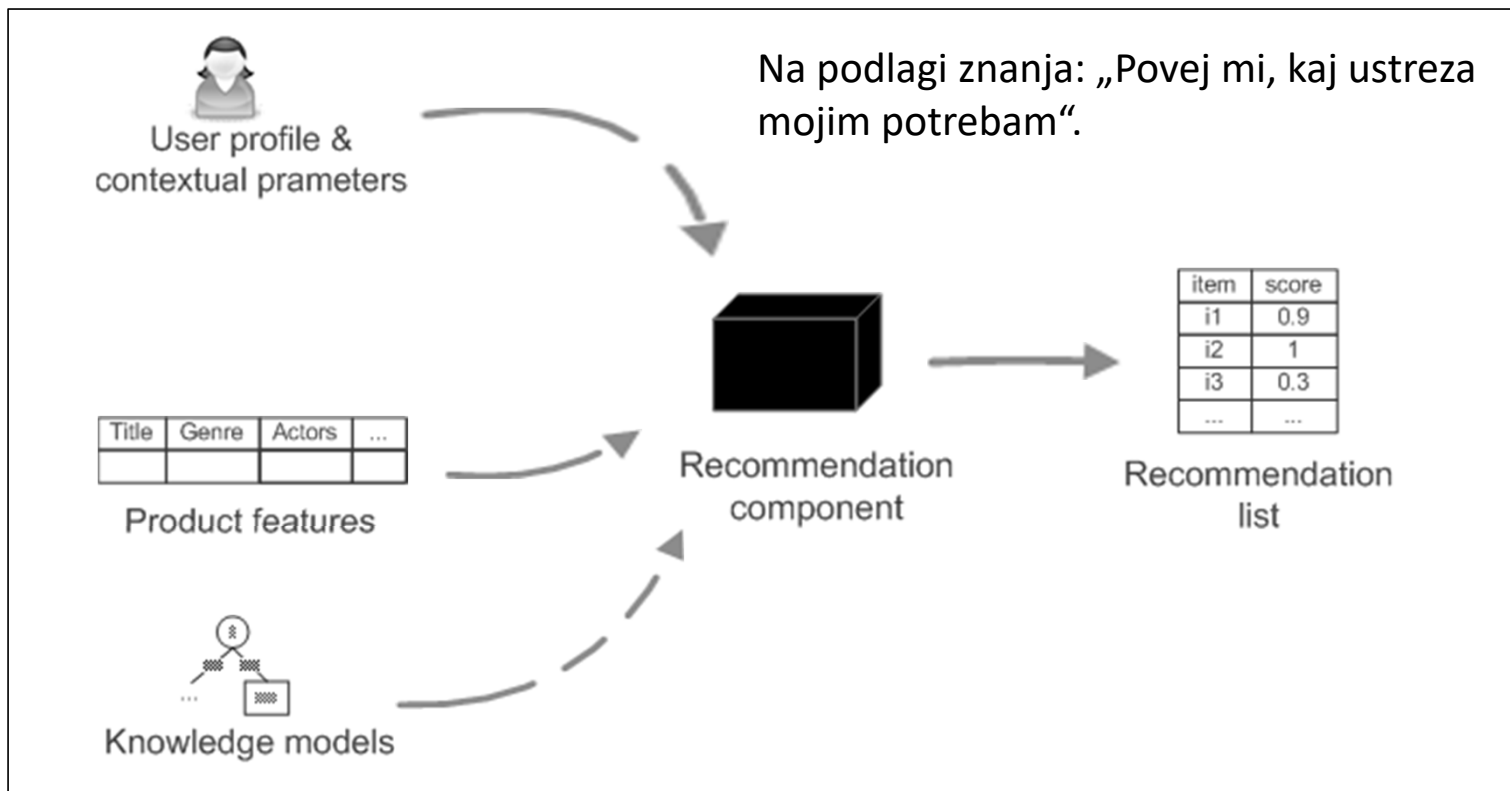
Paradigme priporočilnih sistemov



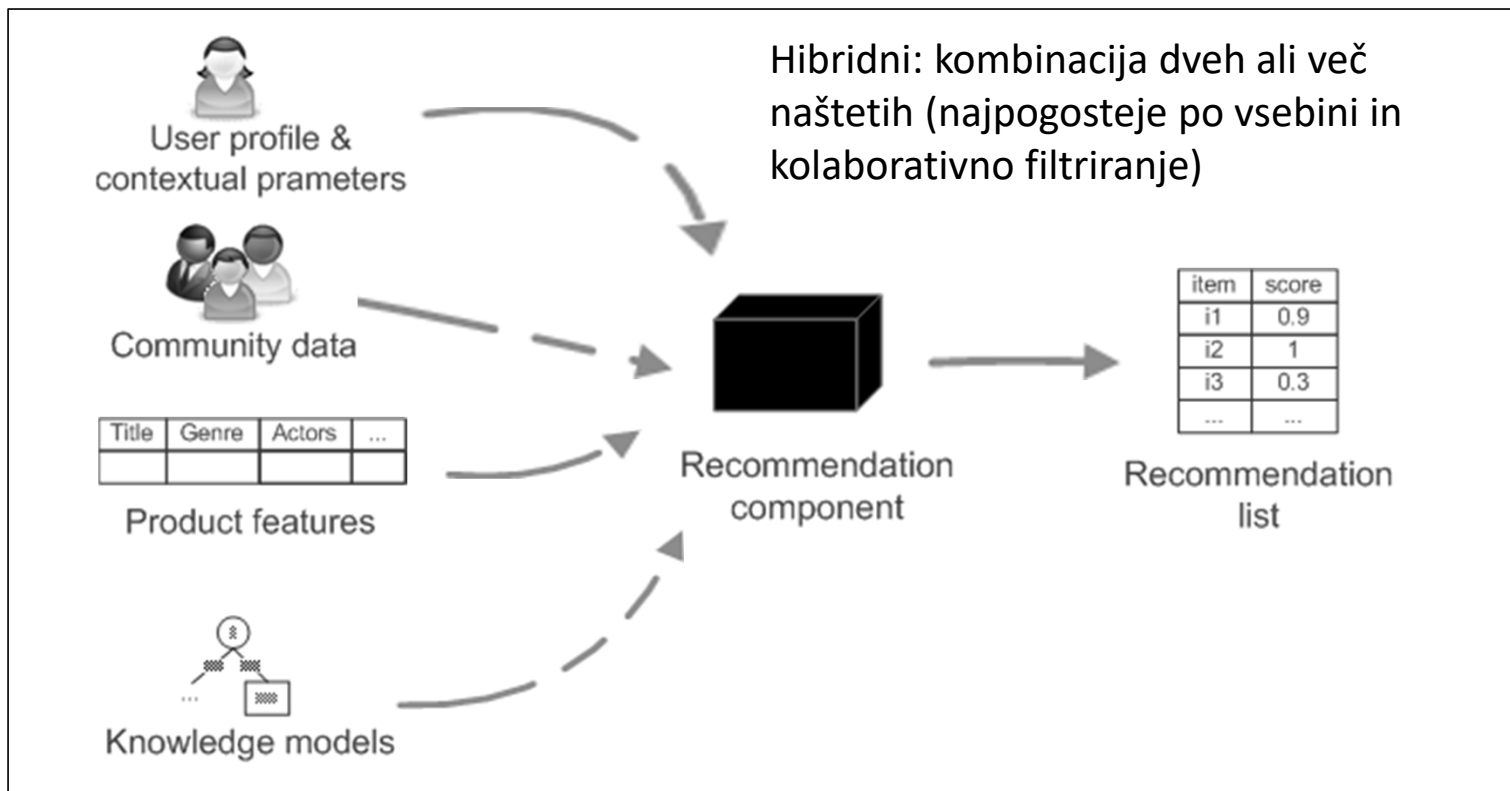
Paradigme priporočilnih sistemov



Paradigme priporočilnih sistemov



Paradigme priporočilnih sistemov



Preferenčna matrika (utility matrix)

↑ izdelki

	1	3	4			?
		3	5			5
			4	5		5
			3			
			3			
2				2		2
					5	
		2	1			1
		3			3	
1						

↑ uporabniki

Preferenca
Ocena
Rating

Priporočanje na podlagi podobnosti med uporabniki ali izdelki (memory based)

- Podobnost med uporabniki: Pearsonov korelacijski koeficient (ali kosinusna podobnost, za izdelke)

$$sim(a, b) = \frac{\sum_{p \in P} (r_{a,p} - \bar{r}_a)(r_{b,p} - \bar{r}_b)}{\sqrt{\sum_{p \in P} (r_{a,p} - \bar{r}_a)^2} \sqrt{\sum_{p \in P} (r_{b,p} - \bar{r}_b)^2}}$$

- Izračun preference:

a, b : uporabnika
 p : izdelek

$$pref(a, p) = \bar{r}_a + \frac{\sum_{b \in N} sim(a, b) * (r_{b,p} - \bar{r}_b)}{\sum_{b \in N} sim(a, b)}$$

(na podlagi najbližjih sosedov $b \in N$)

Priporočanje na podlagi modela (model based)



- Napovedni modeli s področja podatkovnega rudarjenja
 - Regresija
 - SVM
 - Bayesovski modeli
 - Nevronske mreže
 - Latentni faktorji (matrična faktorizacija)

Organizacija podatkov za priporočanje

- Gosta ali redka preferenčna matrika?
- Tipične operacije:
 - Izračun podobnosti
 - Iskanje najbližjih sosedov
 - Izračun, uporaba napovednega modela
 - Matrična faktorizacija
- Izbor primerne metode in organizacije podatkov na nivoju PB
 - Redka predstavitev (user, item, rating)
 - Preproste metode (npr. Slope One)
 - <https://stackoverflow.com/questions/2440826/collaborative-filtering-in-mysql>
 - Nerelacijske PB (grafi)