

Dokumentacija Recommender Sistema - iCinema

1. Opis Implementacije

iCinema koristi hibridni recommender sistem koji kombinira **Content-Based Filtering** i **Collaborative Filtering** pristupe za preporuke filmova korisnicima.

1.1. Tipovi Preporuka

Sistem implementira dva tipa preporuka:

1. **Korisničke Preporuke (User Recommendations)**
 - Personalizovane preporuke bazirane na korisnikovoj istoriji
 - Kombinuje ocjene (ratings) i rezervacije korisnika
 - Uzima u obzir popularnost, svježinu i dostupnost filmova
2. **Slični Filmovi (Similar Movies)**
 - Content-based preporuke bazirane na sličnosti filmova
 - Koristi žanrove, glumce i režisere za izračunavanje sličnosti

1.2. Algoritam

Content-Based Filtering

Svaki film se predstavlja kao **vektor karakteristika** (item vector) koji uključuje: - **Žanrove** (težina: 1.0) - **Glumce** (težina: 0.5) - **Režisera** (težina: 0.8)

Vektori se normalizuju koristeći L2 normu.

User Profile

Korisnički profil se gradi na osnovu: - **Ocjena (Ratings)**: Težina se računa kao $\max(0.2, \min(1.0, \text{rating}/5.0))$ - **Rezervacija**: Težina se računa kao $0.6 * \exp(-\text{days}/90)$ gdje se primjenjuje eksponencijalni decay

Scoring Funkcija

Finalni score za preporuku se računa kao:

$$\text{score} = 1.0 * \text{cosine_similarity} + \text{popularity_boost} + \text{freshness_boost} + \text{availability_boost}$$

Gdje: - **cosine_similarity**: Kosinusna sličnost između korisničkog profila i film vektora - **popularity_boost**: $0.1 * \tanh(\text{popularity}/10)$ - bazirano na rezervacijama u posljednjih 60 dana - **freshness_boost**: $0.05 * (1 - \text{age}/365)$ - bonus za nove filmove (mlađe od godinu dana) - **availability_boost**: $0.05 + 0.03 * \text{projection_count}$ - bonus za filmove dostupne u preferiranom kinu

Similar Movies

Za slične filmove, sistem koristi kosinusnu sličnost između item vektora:

```
similarity = cosine_similarity(movie1_vector, movie2_vector)
```

2. Putanja Glavne Logike

Glavna logika recommender sistema se nalazi u:

Backend: -

iCinema.Infrastructure/Persistence/Repositories/RecommendationRepository.cs -
Metoda GetUserRecommendations() - linije 18-101 - Metoda GetSimilarMovies() - linije
103-130 - Helper metode: - BuildItemVector() - linije 134-160 - Cosine() - linije 180-192
- Normalize() - linije 171-178

API Endpoint: - iCinema.Api/Controllers/RecommendationsController.cs - GET
/recommendations/my - linije 14-25 - GET /recommendations/similar/{movieId} - linije
28-35

Frontend (Mobile): -

iCinema.UI/icinema_mobile_client/lib/features/home/presentation/pages/home_page.dart - Metoda _buildRecommendations() - linija 516 -
iCinema.UI/icinema_mobile_client/lib/features/movies/presentation/pages/movie_details_page.dart - Metoda _buildSimilarMoviesSection() - linija 212

3. Screenshot Source Code-a

3.1. Glavna Metoda – GetUserRecommendations

```
18 ^, public async Task<List<MovieScoreDto>> GetUserRecommendations(  
19     Guid userId,  
20     int topN = 20,  
21     Guid? preferredCinemaId = null,  
22     CancellationToken cancellationToken = default)  
23 {  
24     var movies :List<Movie> = await _context.Movies // DbSet<Movie>  
25         .Include( navigationPropertyPath: m :Movie => m.MovieGenres).ThenInclude(mg => mg.Genre) // IQueryable<Movie,Genre>  
26         .Include( navigationPropertyPath: m :Movie => m.MovieActors).ThenInclude(ma => ma.Actor) // IQueryable<Movie,Actor>  
27         .Include( navigationPropertyPath: m :Movie => m.Director) // IQueryable<Movie,Director?>  
28         .AsNoTracking() // IQueryable<Movie>  
29         .ToListAsync(cancellationToken); // Task<List<...>>  
30  
31     if (movies.Count == 0) return new List<MovieScoreDto>();  
32  
33     var itemVectors :Dictionary<Guid,Dictionary<...>> = movies.ToDictionary(m :Movie => m.Id, BuildItemVector);  
34  
35     var ratings :List<Rating> = await _context.Ratings // DbSet<Rating>  
36         .Where(r :Rating => r.UserId == userId)  
37         .AsNoTracking() // IQueryable<Rating>  
38         .ToListAsync(cancellationToken); // Task<List<...>>  
39  
40     var userReservations :List<Reservation> = await _context.Reservations // DbSet<Reservation>  
41         .Include( navigationPropertyPath: r :Reservation => r.Projection) // IQueryable<Reservation,Projection>  
42         .ThenInclude(p :Projection => p.Movie) // IQueryable<Reservation,Movie>  
43         .Where(r :Reservation => r.UserId == userId && (r.IsCanceled == null || r.IsCanceled == false))  
44         .AsNoTracking() // IQueryable<Reservation>  
45         .ToListAsync(cancellationToken); // Task<List<...>>  
46  
47     var seenMovieIds = new HashSet<Guid>( collection: ratings.Select(r :Rating => r.MovieId) // IEnumerable<Guid>  
48         .Concat(userReservations.Select(r :Reservation => r.Projection.MovieId)));  
49  
50     var profile = new Dictionary<string, double>();  
51     foreach (var r :Rating in ratings)  
52     {  
53         var w :double = Math.Max(0.2, Math.Min(1.0, r.RatingValue / 5.0));  
54         AddScaled( acc: profile, vec: itemVectors.GetValueOrDefault(r.MovieId), w);  
55     }  
56     foreach (var rez :Reservation in userReservations)  
57     {  
58         var days :double = Math.Max(0, (DateTime.UtcNow - rez.ReservedAt).TotalDays);  
59         var decay :double = Math.Exp(-days / 90.0);  
60         var w :double = 0.6 * decay;  
61         AddScaled( acc: profile, vec: itemVectors.GetValueOrDefault(rez.Projection.MovieId), w);  
62     }  
63     Normalize(profile);  
64  
65     // ...  
66 }
```

```

63     Normalize(profile);
64
65     var popularity60d :Dictionary<Guid,double> = await GetPopularityScores(daysBack: 60, cancellationToken);
66
67     var availabilityWindowTo :DateTime = DateTime.UtcNow.AddDays(14);
68     var availabilityMap :Dictionary<Guid,double> = preferredCinemaId.HasValue
69         ? await GetAvailabilityBoostMap(preferredCinemaId.Value, availabilityWindowTo, cancellationToken)
70         : new Dictionary<Guid, double>();
71
72     var results = new List<Movie movie, double score>();
73     foreach (var m :Movie in movies)
74     {
75         if (seenMovieIds.Contains(m.Id)) continue;
76
77         var sim :double = profile.Count == 0 ? 0.0 : Cosine(profile, itemVectors[m.Id]);
78         var popularity :double = popularity60d.TryGetValue(m.Id, out var pop :double) ? pop : 0.0;
79         var popularityBoost :double = 0.1 * Math.Tanh(popularity / 10.0);
80
81         double freshnessBoost = 0.0;
82         if (m.ReleaseDate.HasValue)
83         {
84             var ageDays :double = (DateTime.UtcNow.Date - m.ReleaseDate.Value.ToDateTime(TimeOnly.MinValue)).TotalDays;
85             freshnessBoost = ageDays <= 365 ? 0.05 * (1.0 - Math.Clamp(ageDays / 365.0, 0.0, 1.0)) : 0.0;
86         }
87
88         var availabilityBoost :double = availabilityMap.TryGetValue(m.Id, out var avail :double) ? avail : 0.0;
89
90         var score :double = 1.0 * sim + popularityBoost + freshnessBoost + availabilityBoost;
91         if (score > 0)
92             results.Add((movie:m, score));
93     }
94
95     return results // List<(movie,score)>
96         .OrderByDescending(x :(movie,score) => x.score)
97         .ThenBy(x :(movie,score) => x.movie.Title) // IOrderedEnumerable<(movie,score)>
98         .Take(topN) // IEnumerable<(movie,score)>
99         .Select(x :(movie,score) => ToDto(x.movie, x.score)) // IEnumerable<MovieScoreDto>
100         .ToList(); // List<MovieScoreDto>
101 }
102

```

```

162 private static void AddScaled(Dictionary<string, double> acc, Dictionary<string, double>? vec, double weight)
163 {
164     if (vec == null || weight <= 0) return;
165     foreach (var kv in vec)
166     {
167         acc[kv.Key] = acc.GetValueOrDefault(kv.Key) + kv.Value * weight;
168     }
169 }
170
171 Windsurf: Explain | Refactor | Docstring | x
172 2 usages Velid Duranovic
173 private static void Normalize(Dictionary<string, double> vec)
174 {
175     double norm = Math.Sqrt(vec.Values.Sum(v :double => v * v));
176     if (norm <= 1e-9) return;
177     var keys :List<string> = vec.Keys.ToList();
178     foreach (var k :string in keys)
179         vec[k] = vec[k] / norm;
180 }

```

3.2. BuildItemVector - Kreiranje Vektora Karakteristika

```
134     private static Dictionary<string, double> BuildItemVector(Movie m)
135     {
136         var vec = new Dictionary<string, double>();
137         foreach (var mg in m.MovieGenres)
138         {
139             if (mg.Genre != null)
140             {
141                 var key = $"g:{mg.Genre.Id}";
142                 vec[key] = vec.GetValueOrDefault(key) + 1.0;
143             }
144         }
145         foreach (var ma in m.MovieActors)
146         {
147             if (ma.Actor != null)
148             {
149                 var key = $"a:{ma.Actor.Id}";
150                 vec[key] = vec.GetValueOrDefault(key) + 0.5;
151             }
152         }
153         if (m.Director != null)
154         {
155             var key = $"d:{m.Director.Id}";
156             vec[key] = vec.GetValueOrDefault(key) + 0.8;
157         }
158         Normalize(vec);
159         return vec;
160     }
161 }
```

3.3. Cosine Similarity - Izračunavanje Sličnosti

```
180     private static double Cosine(Dictionary<string, double> a, Dictionary<string, double> b)
181     {
182         if (a.Count == 0 || b.Count == 0) return 0.0;
183         var smaller :Dictionary<string,double> = a.Count <= b.Count ? a : b;
184         var larger :Dictionary<string,double> = ReferenceEquals(smaller, a) ? b : a;
185         double dot = 0.0;
186         foreach (var kv in smaller)
187         {
188             if (larger.TryGetValue(kv.Key, out var v :double ))
189                 dot += kv.Value * v;
190         }
191         return dot;
192     }
193 }
```

4. Putanja i Screenshot iz Pokrenute Aplikacije

4.1. Preporučeni Filmovi (Home Page)

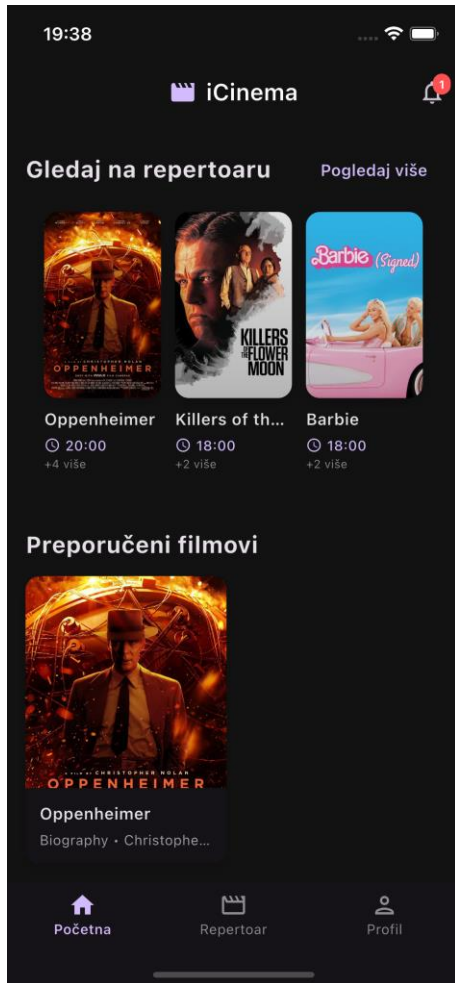
Putanja u aplikaciji: - Home Page → Sekcija “Preporučeni filmovi”

Putanja u kodu: -

iCinema.UI/icinema_mobile_client/lib/features/home/presentation/pages/home_page.dart - Metoda _buildRecommendations() - linija 516

API Endpoint: - GET /recommendations/my - Zahtijeva autentifikaciju (Bearer token)

Screenshot:



4.2. Slični Filmovi (Movie Details Page)

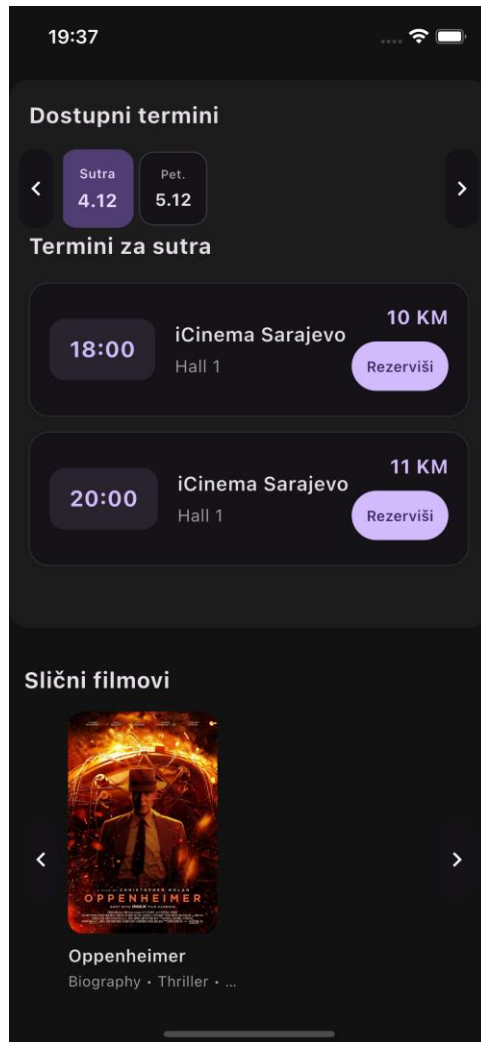
Putanja u aplikaciji: - Movie Details Page → Sekcija “Slični filmovi”

Putanja u kodu: -

iCinema.UI/icinema_mobile_client/lib/features/movies/presentation/pages/movie_details_page.dart - Metoda _buildSimilarMoviesSection() - linija 212

API Endpoint: - GET /recommendations/similar/{movieId}?top=20 - Ne zahtijeva autentifikaciju (AllowAnonymous)

Screenshot:



5. Tehnički Detalji

5.1. Performanse

- Sistem koristi **AsNoTracking()** za Entity Framework upite radi boljih performansi
- Item vektori se kreiraju jednom i koriste za sve filmove
- Popularnost se računa za posljednjih 60 dana
- Dostupnost se provjerava za sljedećih 14 dana

5.2. Filtri

- Filmovi koje je korisnik već ocjenio ili rezervisao se **isključuju** iz preporuka
- Samo filmovi sa score > 0 se vraćaju
- Rezultati se sortiraju po score-u (opadajuće), zatim po naslovu

5.3. Parametri

- **topN**: Broj preporuka (default: 20)
 - **preferredCinemaId**: Opcioni ID preferiranog kina za availability boost
 - **daysBack**: Period za izračunavanje popularnosti (default: 60 dana)
-

6. Zaključak

iCinema recommender sistem koristi hibridni pristup koji kombinuje: - **Content-Based Filtering** za slične filmove - **Collaborative Filtering** za personalizovane preporuke - **Popularity-based** i **Freshness-based** boost-ove za bolje rezultate - **Availability-based** boost za filmove dostupne u preferiranom kinu

Sistem je optimizovan za performanse i skalabilnost, koristeći efikasne algoritme i caching strategije.