

EECS 750: Advanced Operating Systems

2/14 /2014

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Administrative

- **Project proposal**
 - Deadline is **extended to Feb 22**
 - Discuss with me about your project idea before the deadline
- Next summary assignment due: 11:59 p.m., Sunday
 - Email subject line: [EECS750] Summary: Paper name
- Class presentation
 - Email subject line: [EECS750] Presentation: Paper name
 - Don't need to write a summary for the paper you present
 - If you present one paper this week, you only need to write 1 additional summary. If you present two, 0 summary is required.

Recap: Paragon

- Recommendation systems
 - *Learn each user's taste* in something (e.g., movies, books,...) and *recommend a few items* out of many
 - Netflix (movie), Amazon (books, music, products)



Recommendation System

- Key idea
 - If we know each **movie's features**
 - E.g.) Titanic: action=0.2, romance=0.5, ...
 - And each **user's preference**
 - E.g.) Alice: action=5, romance=3
 - A movie's **rating** for an user can be **estimated**
 - $\text{Rating}(\text{Titanic}, \text{Alice}) = 0.2 * 5 + 0.5 * 3 = 2.5$

Recommendation System

| | | | | | | Movie's feature | |
|--------------------------|----------------------|-----------|---------|-----------|----------|--------------------|-------------------|
| | Movie | Alice (1) | Bob (2) | Carol (3) | Dave (4) | x_1 (romance) | x_2 (action) |
| | Love at last | 5 | 5 | 0 | 0 | 0.9 | 0 |
| | Romance forever | 5 | ? | ? | 0 | 1.0 | 0.01 |
| | Cute puppies of love | ? | 4 | 0 | ? | 0.99 | 0 |
| | Nonstop car chases | 0 | 0 | 5 | 4 | 0.1 | 1.0 |
| | Swords vs. karate | 0 | 0 | 5 | ? | 0 | 0.9 |
| User's Preference | romance | 5 | 1 | 2 | 2 | | |
| | action | 3 | 5 | 2 | 2 | | |

Table source: Adopted from Machine Learning at Coursera by Andrew Ng of Stanford

Collaborative Filtering

- Automatically assign values for movie features and user preferences
 - Given movie features and movie ratings estimate *user preferences*
 - Given user preferences and movie ratings estimate *movie features*

Classification for Heterogeneity

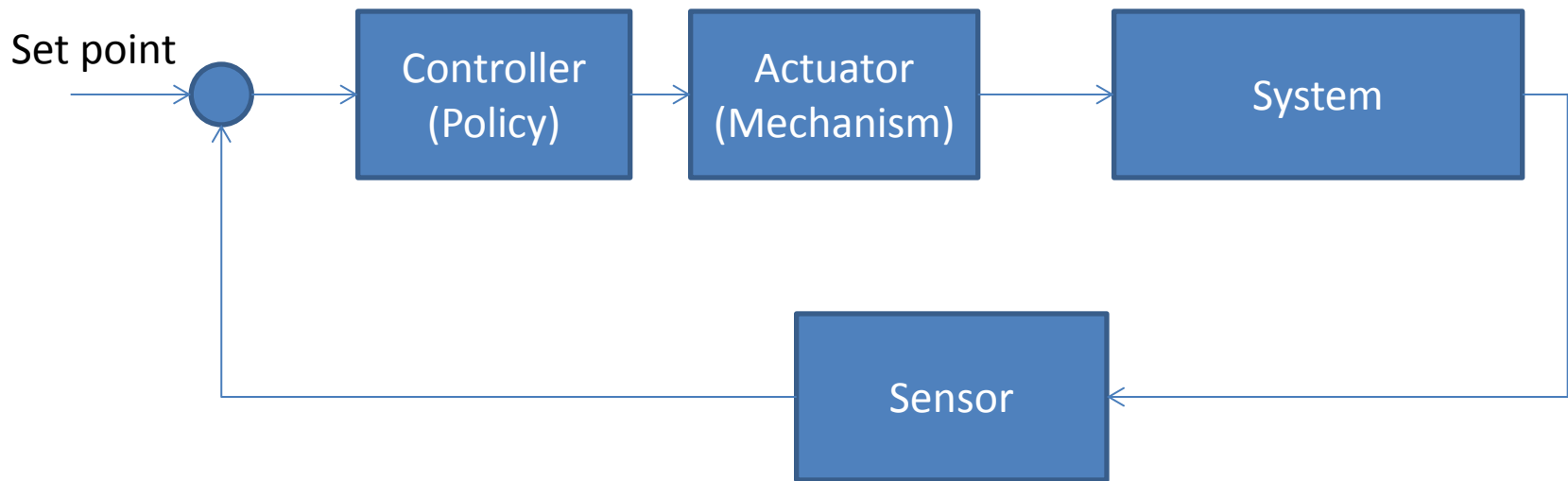
| The Netflix Challenge | Platform Classification |
|--|---|
| Recommend movies to users | Recommend platforms to apps |
| Utility matrix rows → users | Utility matrix rows → apps |
| Utility matrix columns → movies | Utility matrix columns → platforms |
| Utility matrix elements → movie ratings | Utility matrix elements → app scores |

- **Offline mode**
 - ▣ Profile a few apps (20-30) across the different configurations
 - ▣ Assign performance scores per run (IPS, QPS, other system metric)
- **Online mode**
 - ▣ For each new app, run briefly on two platforms (1 min)
 - ▣ Assign performance scores
 - ▣ Derive missing entries & identify similarities between apps

Today

- Topic: Cloud level scheduling 3
- Some background
- [Q-clouds: managing performance interference effects for qos-aware clouds, EUROSYS'10](#)

Feedback Control Loop



Comparison

- CPI²
 - Runtime monitoring and troubleshooting
- Paragon
 - Preventing (minimizing) troubles via scheduling
- **Q-clouds**
 - Runtime monitoring and **controlling**

Today's Paper

- [Q-clouds: managing performance interference effects for qos-aware clouds, EUROSYS'10](#)