

# **AVATAR: An Advanced Multi-Agent Recommender System of Personalized TV Contents by Semantic Reasoning**

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# Motivation of TV Recommender Systems

## ● Motivation of TV Recommender Systems

- Related Work
- Main Design Decisions
- The Architecture
- The Contributions of AVATAR
- The LIKO language
- Conclusions
- Further Work

- Migration from analogue to digital TV.
- Implications:
  - ◆ More channels in the same bandwidth.
  - ◆ Software applications mixed with audiovisual contents.



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- Migration from analogue to digital TV.
- Implications:
  - ◆ More channels in the same bandwidth.
  - ◆ Software applications mixed with audiovisual contents.
- Disoriented users among large amount of irrelevant information.
  - ◆ User cannot use this new type of TV efficiently.
  - ◆ Necessary tools to find interesting TV programs



# Related Work

- Motivation of TV Recommender Systems

## ● Related Work

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- Different approaches in the field of TV personalization tools:
  - ◆ Bayesian techniques
  - ◆ Decision trees
  - ◆ Content-based methods
  - ◆ Collaborative filtering
  - ◆ ...



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- Different approaches in the field of TV personalization tools:
  - ◆ Bayesian techniques
  - ◆ Decision trees
  - ◆ Content-based methods
  - ◆ Collaborative filtering
  - ◆ ...
- A common base: **limitation in reasoning capabilities.**
  - ◆ Mechanisms to represent the knowledge of TV domain are not used in previous proposals.
  - ◆ Reasoning process allows to obtain enhanced recommendations.



# AVATAR: Main Design Decisions (I)

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- A TV recommender system based on the experience gained in the field of **Semantic Web**.



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- A TV recommender system based on the experience gained in the field of **Semantic Web**.
- Semantic reasoning about user preferences and TV contents. Key elements are:



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- A TV recommender system based on the experience gained in the field of **Semantic Web**.
- Semantic reasoning about user preferences and TV contents. Key elements are:
  - ◆ **TV-Anytime** specification for:
    - Generic descriptions of TV programs: title, genre, set of keywords, etc.
    - User preferences
    - User viewing history
  - ◆ Knowledge about TV domain provided by an **OWL ontology**.





# AVATAR: Main Design Decisions (II)

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- The system must be updated when user preferences change.
  - ◆ Goal: personalized and higher quality recommendations.



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- The system must be updated when user preferences change.
  - ◆ Goal: personalized and higher quality recommendations.
- **AVATAR** must be flexible enough to favor updating process.
  - ◆ MHP applications tuned in user's receiver (Set-Top Box or STB).



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- The system must be updated when user preferences change.
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- **AVATAR** must be flexible enough to favor updating process.
  - ◆ MHP applications tuned in user's receiver (Set-Top Box or STB).
- MHP applications run in the context of a service or event.
  - ◆ Problem: All user actions must be recorded all the time: **local agent** to watch the viewer behaviour.
  - ◆ Local agent stores feedback information.
  - ◆ Normalized access by TV-Anytime MHP API.



# AVATAR: The Architecture (I)

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- A modular architecture based on multiple agents.
  - ◆ Efficient use of knowledge inference strategies.



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- A modular architecture based on multiple agents.
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- Local software of user's STB
- MHP applications  $\Rightarrow$  recommendation service



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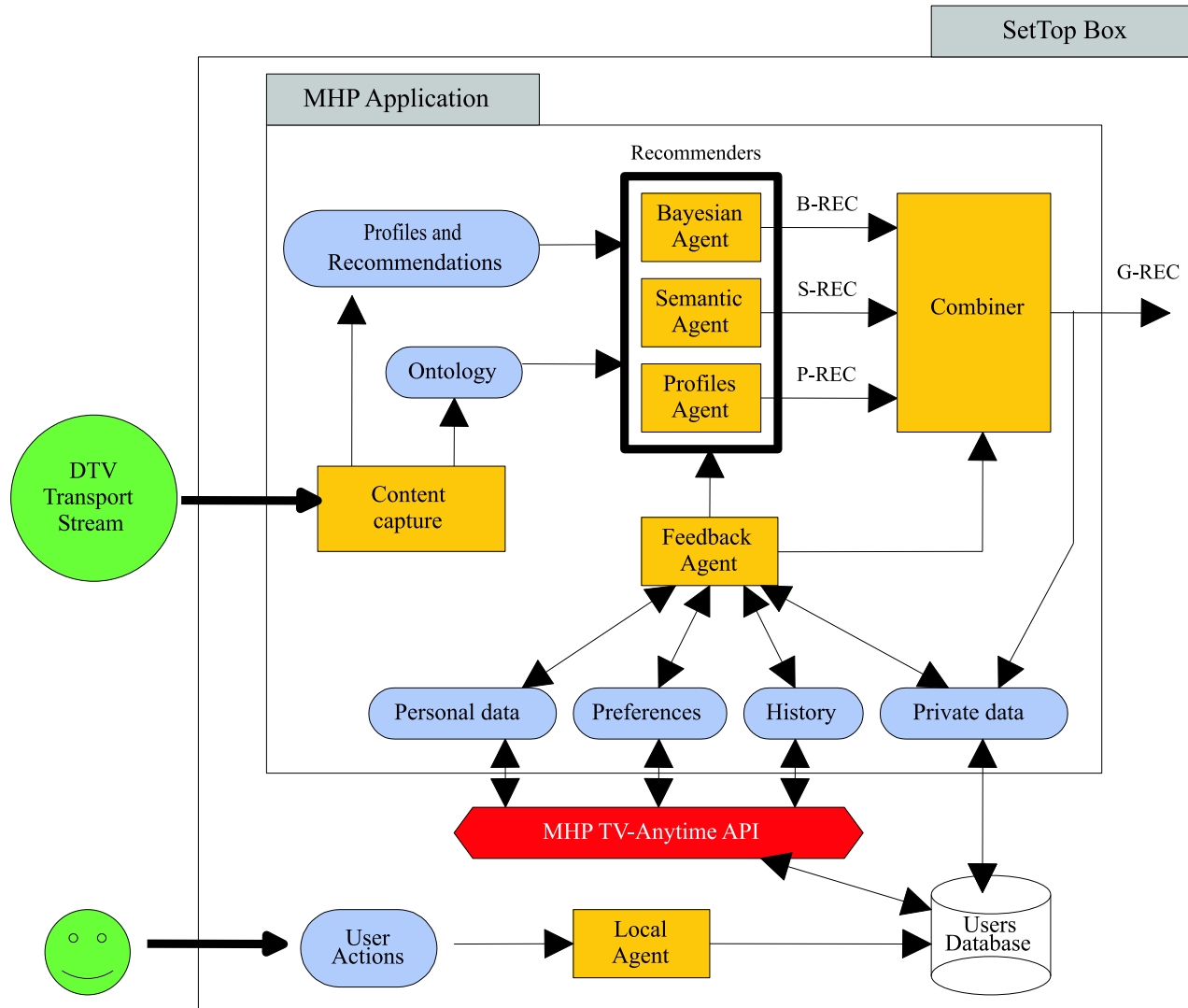
- Further Work

- A modular architecture based on multiple agents.
  - ◆ Efficient use of knowledge inference strategies.
- Local software of user's STB
- MHP applications  $\Rightarrow$  recommendation service
  - ◆ Capture and classifications of received information
  - ◆ Recommenders:
    - Bayesian agents
    - Agents based on profiles matching
    - Semantic agents
  - ◆ Feedback system



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# The AVATAR contributions (I)

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## ■ Semantic Web:

- ◆ thinks the Web as a knowledge repository
- ◆ searches the personalization of the service offered to the end users
- ◆ improves the traditional syntactic content search (*Google*)





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## ■ Semantic Web:

- ◆ thinks the Web as a knowledge repository
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## ■ **AVATAR** uses Semantic Web technologies:

- ◆ Goal is to discover semantic relations among TV programs leading to enhanced recommendations.



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## ■ Semantic Web:

- ◆ thinks the Web as a knowledge repository
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## ■ AVATAR uses Semantic Web technologies:

- ◆ Goal is to discover semantic relations among TV programs leading to enhanced recommendations.
- ◆ Main needs are:
  - Metainformation
  - Tools to explore the hierarchy of classes and properties defined in the OWL ontology



# The AVATAR contributions (II)

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- There exist classical tools in the domain of Description Logics  $\Rightarrow$  **RACER**
- **RACER** is a Semantic Web inference engine to explore the knowledge base.



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- There exist classical tools in the domain of Description Logics  $\Rightarrow$  **RACER**
- **RACER** is a Semantic Web inference engine to explore the knowledge base.
- We propose the query language **LIKO** based on RACER
  - ◆ Goal: Infer knowledge from OWL ontology to define semantic relations between programs of interest for the user and other TV contents.



# The LIKO language (I)

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- Extraction operations:
  - ◆ Related to an input class
    - Subclasses (Operator  $\triangleright$ )
    - Superclasses (Operator  $\triangleleft$ )
  - ◆ Related to an input property
    - Subproperties (Operator  $\gg$ )
    - Superproperties (Operator  $\ll$ )



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## ■ Extraction operations:

### ◆ Related to an input class

- Subclasses (Operator  $\triangleright$ )
- Superclasses (Operator  $\triangleleft$ )

### ◆ Related to an input property

- Subproperties (Operator  $>>$ )
- Superproperties (Operator  $<<$ )

### ◆ Related to input instances or Datatype properties

- Properties where the input argument appears as domain (Operator  $>\Rightarrow$ )
- Properties where the input argument appears as range (Operator  $>\Leftarrow$ )



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- Inference operations:
  - ◆ They are implemented by previous query operators.
  - ◆ *Infer knowledge* from the properties defined in the OWL ontology
    - Transitive properties (Operator  $>\odot$ )
    - Functional properties (Operator  $>\oplus$ )
    - Inverse properties (Operator  $>\ominus$ )
    - Symmetric properties (Operator  $>\leftrightarrow$ )



# Conclusions

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- The semantic reasoning allows to obtain an intelligent recommender
- **AVATAR:**
  - ◆ is able to understand the TV domain knowledge organized in an OWL ontology.
  - ◆ suggests in an autonomous way enhanced and higher quality recommendations.
  - ◆ goes beyond the conventional syntactic content search of previous approaches.





# Further Work

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- We are working on a semantic reasoning framework:
  - ◆ Application of the  $ALC(\mathcal{D})$  Description Logic in user profiles.
  - ◆ Classification of semantic relations among TV programs.
  - ◆ Inference algorithms to reason on the OWL ontology by the LIKO language.
  - ◆ Ranking mechanisms to order the inferred relations according to their semantic relevance.



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Thank you for your attention