



LUDWIG-
MAXIMILIANS-
UNIVERSITÄT
MÜNCHEN

LFE Medieninformatik • Susanne Keck

Diploma Thesis – Final Presentation

Incremental Personalized Trip Planning

Supervisor: Yaxi Chen

Responsible Professor: Prof. Dr. Andreas Butz



- Motivation

- Increasing popularity of Recommender Systems
- Complexity of trip planning process
- Pre-defined travel packages do not meet the explorative experience of trip planning
- Current systems do not support the tourist's dynamically changing preferences



- Topic of the Thesis

- Design of an interactive trip planning system
- Efficient combination of human interaction and system intelligence
- Explore travelers' behavior in their trip planning









- Related Work
- Tourists' Requirements
- SARA: Stepwise Advanced Route Advisor
- System Implementation
- User Study
- Outlook

- On-Tour Guides with Mobile Devices
 - Information is provided based on the user's current location
 - Examples: *Cyberguide* [Abowd, 1997], *GUIDE* [Cheverst, 2000], *MyMap* [Carolis, 2007]
- Pre-Visit Trip Planning Systems
 - Generation of textual-based trip plans
 - A) Manual trip plan generation
 - Examples: *Yahoo! Travel* [2009], *LonelyPlanet* [2009], *Realtravel* [2009]
 - B) Automatic trip plan generation
 - Examples: *STAR* [Goy, 2004], *GraniteNights* [Grimnes, 2003], *e-Tourism* [Sebastia, 2008], *Home&Abroad* [2009]

Your Itinerary for **Barcelona**

% Match	Name
Day 1	
 100%	<u>Plaça Catalunya</u> Streets & Squares Visit Time: 1hr - Half day(4hr) Location: Downtown
 82%	<u>Casa Milà (La Pedrera)</u> Castles, Palaces, Historic Homes Visit Time: 30min - 1.5hr Location: Central
 83%	<u>Carrer Ferran</u> Streets & Squares Visit Time: 30min - 1.5hr Location: Downtown
Day 2	
 79%	<u>Barri de Gràcia</u> Neighborhoods Visit Time: 2hr - Half day(4hr) Location: Downtown

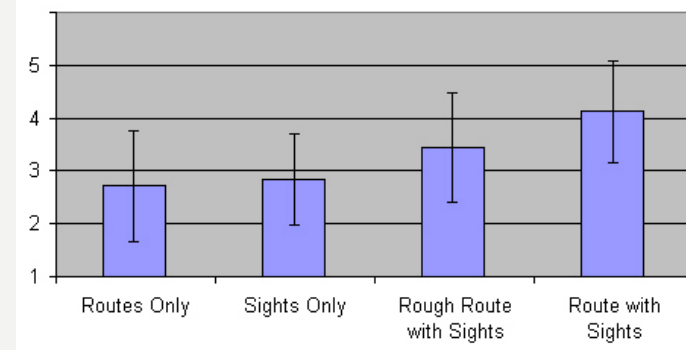
(Home&Abroad, 2009)



- Primary Studies
 - Expert interview with a travel agent
 - Online survey with 100 participants
- Design Guidelines
 - Combination of human interaction and system intelligence
 - Considering multiple constraints
 - Dynamic behavior of tourists' preferences
 - Decomposition of the planning process
 - Importance of system transparency
 - Provide an enjoyable planning experience



Trip Plan Visualization Approaches





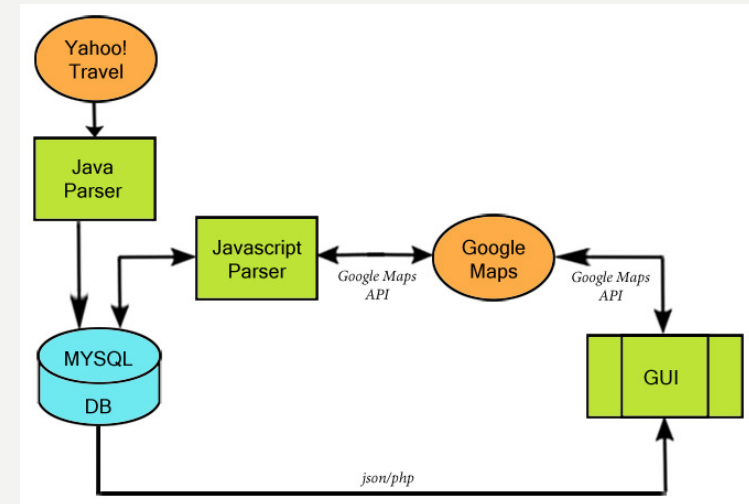
- SARA (Stepwise Advanced Route Advisor)
 - Construction of an executable tour plan for the city to visit
 - Concept of incremental trip planning
- Features of SARA
 - Dynamic user preferences
 - Considering multiple constraints (opening times, user preferences, distance and popularity)
 - Representation of trip plan via route and calendar
- Demo Video





- System Architecture

- MySQL DB: stores data from different sources
- Sources: Yahoo! Travel, Google Maps
- Data: Opening Times, Popularity, Distances,...



- Recommendation Algorithm

- Computation of recommendation scores for all sights available

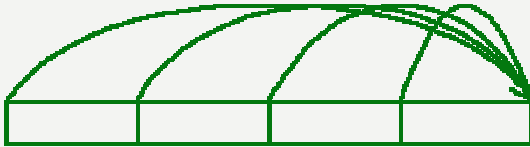
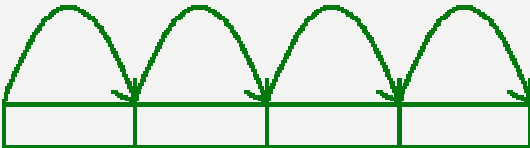
$$\begin{aligned}
 \textit{recommendationScore}(\textit{sight}_i) = & \textit{popularityWeight} \cdot \frac{\textit{sight}_i.\textit{popularity}}{\textit{maximumPopularity}} + \\
 & (100 - \textit{popularityWeight}) \cdot \left(1 - \frac{\textit{sight}_i.\textit{distance}}{\textit{maximumDistance}} \right)
 \end{aligned}$$



- No recommendations mode
 - System makes no explicit recommendations for next sight
 - User constructs trip plan manually

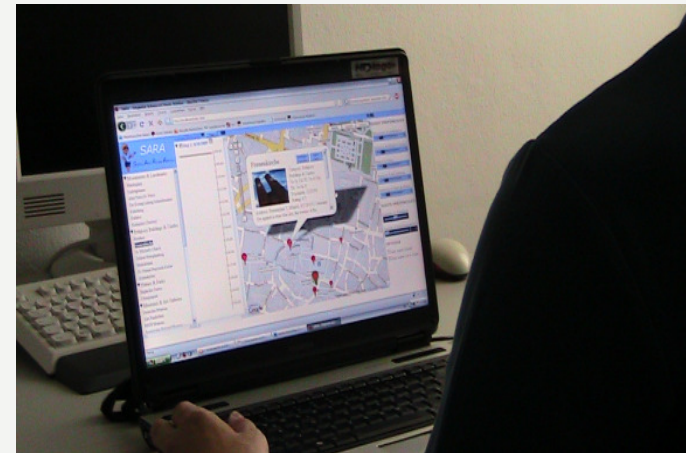
- Local recommendations mode
 - System makes recommendations for next sight
 - User makes final decision of each sight to be included in the plan

- Global recommendations mode
 - System generates the whole plan automatically (based on a greedy algorithm)
 - User can then make adjustments of this plan

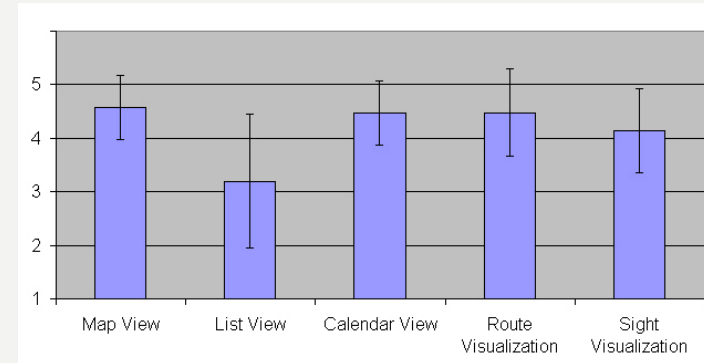




- Goals
 - Evaluate the overall impression of SARA
 - Investigate the appropriate degree of automation
- Design
 - Repeated measures within participants factorial design
 - Task: Generate a two-days trip plan in the city of Munich with each system mode
- Participants
 - 21 participants (10 male, 11 female), average age: 24 (mostly students)
 - Trip planning experience: 3.19, Munich experience: 3.67

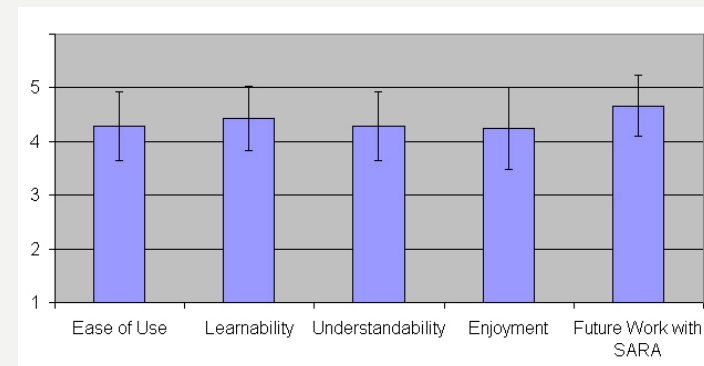


- Visualization components
 - Advantage of single user interface
 - Usefulness of map view, calendar view, route and sight visualization



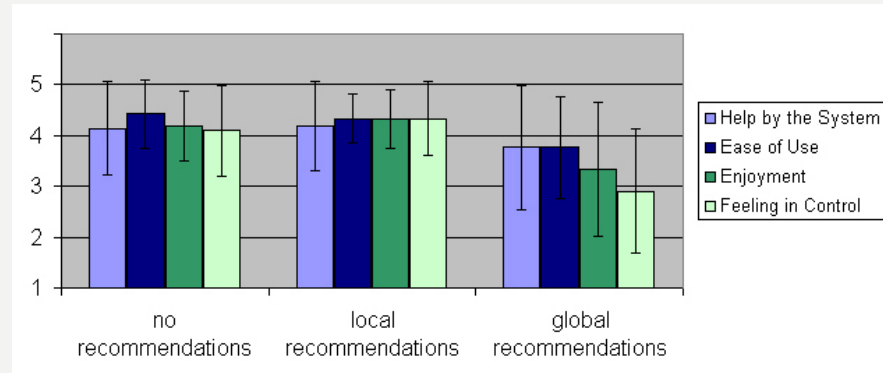
- Dynamic Preferences
 - Usefulness of sight preferences to control indirect recommendations
 - Usefulness of route preferences to control explicit recommendations

- Overall feedback
 - Enjoyment of explorative experience
 - Value of own decision-making
 - Transparency of recommendations





- Usage Experience
 - Especially less enjoyment and feeling in control in global mode

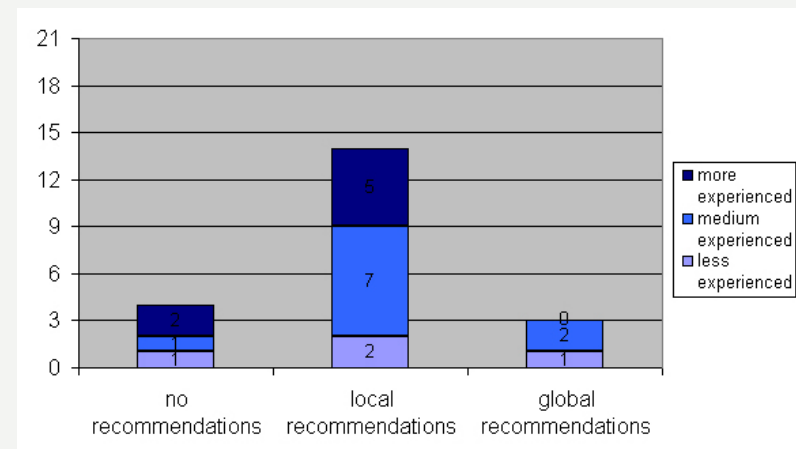
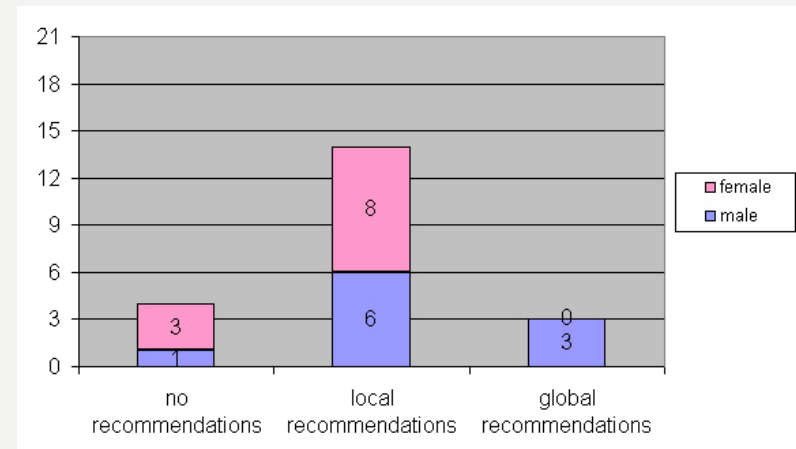


- Time Efficiency
 - Quantitative: no (8:08), global (8:35), local (8:47)
 - Qualitative: local (4.43), no (4.19), global (3.48)
- Trip Plan Quality
 - Quantitative: no (0.881), local (0.871), global (0.865)
 - Qualitative: no (3.95), local (3.90), global (3.86)

$$tripPlanQuality(tripPlan) = \frac{sightQuality(tripPlan) + routeQuality(tripPlan)}{2}$$



- Gender Difference
 - Global: preferred by male participants
 - No: preferred by female participants
 - Females like to be in control over the trip planning process
- Trip Planning Experience Difference
 - Global: preferred by less experienced
 - No: preferred by more experienced
 - More experienced trip planners like to be in control over the trip planning process





- Summary
 - Incremental trip planning seems to be appealing
 - Explorative experience, dynamic user preferences and quick overview on information space need to be supported
- Future Work
 - Investigate the usability and learnability of SARA
 - Explore trip planning patterns
 - Enlarge the system for other cities
 - Add additional features (more flexibility, search function, other activities)
 - Integration of a learning algorithm



LUDWIG-
MAXIMILIANS-
UNIVERSITÄT
MÜNCHEN



*Incremental
Personalized Trip
Planning System*



Thank you for your attention!



- Formula
 - Route Quality

$$\text{routeQuality}(\text{tripPlan}) = \frac{\sum_{i=1}^n \text{sight}_i.\text{duration}}{\sum_{i=1}^n \text{sight}_i.\text{duration} + \sum_{i=1}^{n-1} \text{duration}(\text{sight}_i, \text{sight}_{i+1})}$$

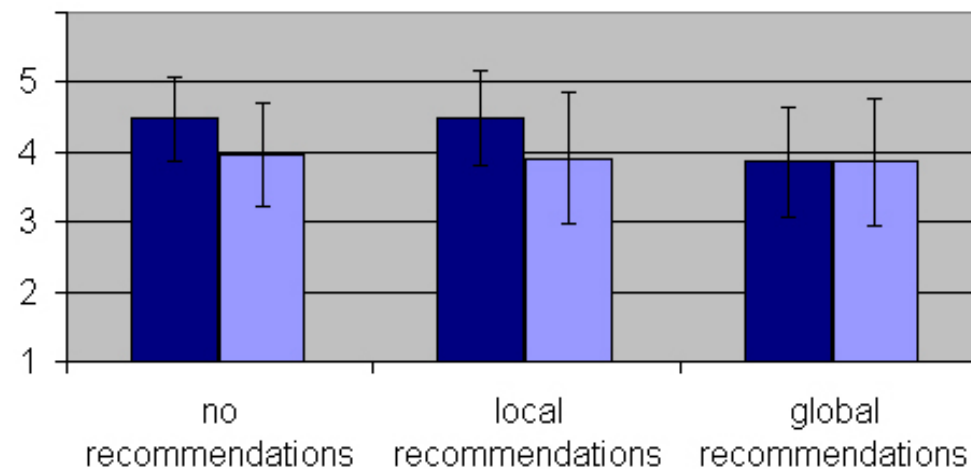
- Sight Quality

$$\text{sightQuality}(\text{tripPlan}) = \cos(\alpha) = \frac{\vec{V}_u \circ \vec{V}_t}{\|\vec{V}_u\| \cdot \|\vec{V}_t\|}$$

- Example (Sight Quality)
 - Sight preferences: 80%, 20%, 100% $\rightarrow V_u = (40\%, 10\%, 50\%)$
 - Sights included: 3, 3, 6 $\rightarrow V_t = (25\%, 25\%, 50\%)$
 - Sight Quality: 0.945

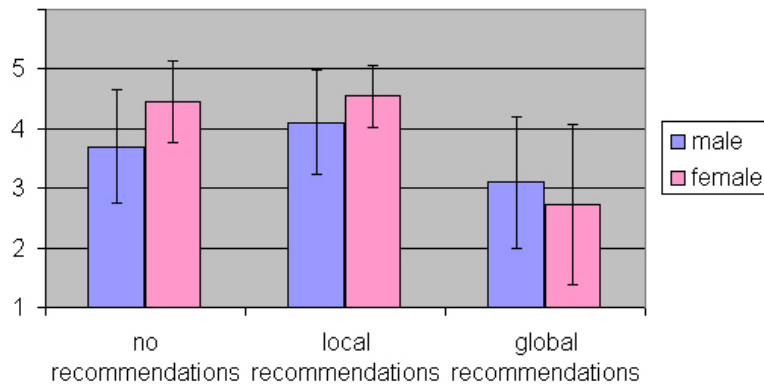


Trip Plan Quality - qualitative

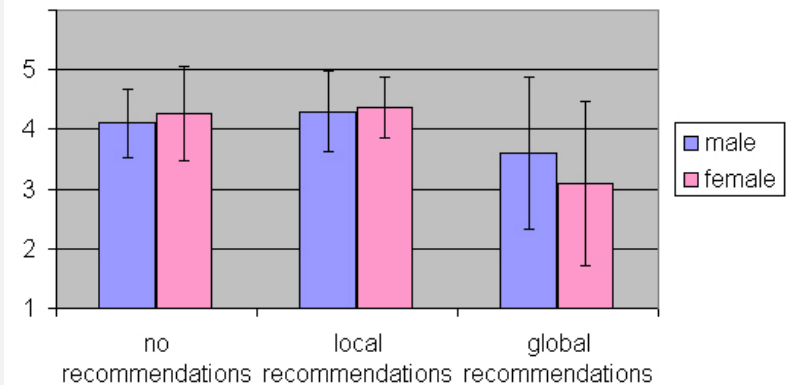




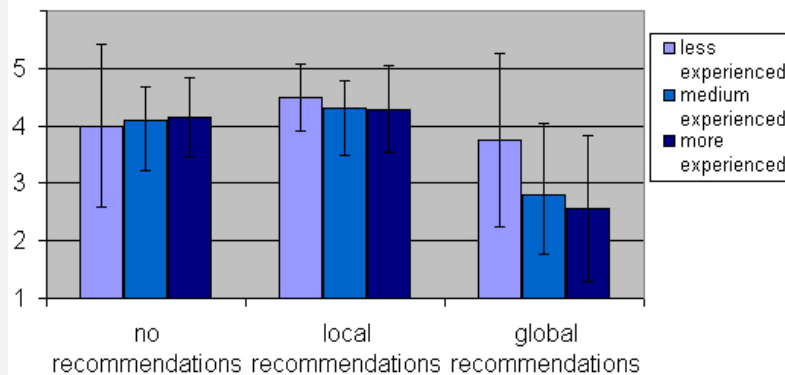
Feeling in Control



Enjoyment



Feeling in Control



Ease of Use

