Aalborg University

Multimedia Recommendations

P3-Project

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Chapter 1

Introduction

Entertainment media is a part of almost all people's lives in some shape or form. It is something we seek out and consume almost every single day. Here is things like books, films, video games, music, etc included. For that, there exist various kinds of way to spread a piece of media to the public, like websites, application, advertising, and social groups. Here can a system which generates recommendations based on various kinds of data, like personal information, media data, and social connections, also be included. Either directly or indirectly. This kind of recommendation is tailored towards a certain person, and is there to make them aware that there might be other products which he could be interested in. Like a movie that is similar in genre to what a person previously have watched, or an add-on product to a previous purchase on a retail website.

Recommendation systems have various problems before them hindering its effectiveness, like data shortage. It is also very crucial that proper weights can be generated for the various kinds of data, so the most important aspect of a piece of media is highlighted for the individual person. And interesting feature could be if it were able to generate recommendations across different kinds of media, E.g. if you liked these books, maybe you would like this movie, then it would also require a set of suitable connections between them, to create the recommendation. Since these kinds of systems is centered around the user, it is also important to include some kind of survey to study people's habits regarding media. These surveys could also provide weights for how important certain kinds of data is. These challenges is what creates the base problem for this project.

1.1 Initiating Problem

What challenges exist for recommender systems, what is different peoples habits regarding recommendations from various sources, and to what degree is it possible for recommending media across different kinds of media?

Chapter 2

Problem Analysis

2.1 Recommender Systems

2.1.1 Collaborative Recommendations

2.1.2 Content Based Recommendations

2.2 Recommendation Statistics

In a study conducted by Harris Interactive (Footer with link) among 2.311 U.S. adults ages 18 and over, on how they use and feel about interaction on the internet. It was conducted between April 28 and 30 2010. They asked different question and some of them are quite interesting. Although it was conducted in America, the information can still be used in our project. The idea behind our project is to create a website that can be accessed from across the world. So different studies in different countries are useful for the information needed to determine the target group. That is why this information is useful for our project.

The first graph asks the question about what the asked person shares through social media. They were to select all that applies to them. If we take a look on what the different options was, one stands out and that is: TV and movie recommendations. In the range from 18 to 34 year old, 36 percent of them says that they share TV and movie recommendations on social media.

The first interesting question and answer is, that in short terms asks what the person share on social media and select all that applies. If we take a look on what the different options were one strikes out and that is; TV and movie recommendations. In the range from 18 to 34 year olds, 36 percent of them

Which of the following, if any, do you share about yourself through social media? When thinking about social media, please think of blocks, microblogs, message boards, comments you leave on articles, social networking websites, and photo and video sharing websites. Please select all that apply.
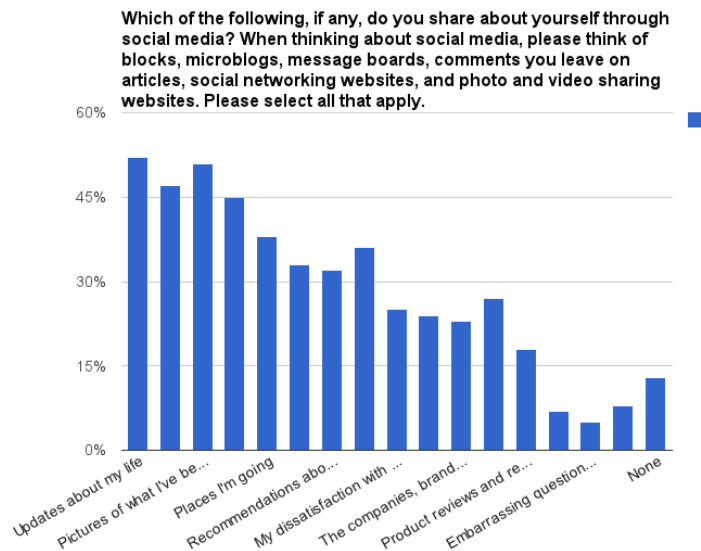
Figure 2.1: 1

says that they share TV and movie recommendations on social media.

The second graph pose the question about how much different reviews from different people influence them. It shows that 71 percent of those asked replied that they are influenced a great deal or a fair amount by reviews from family members or friends.

The second graph asks the question about how much different things influence them. It shows that a staggering 71 percent of those asked, replied that they are influenced a great deal or a fair amount by reviews from family members or friends. That shows that social recommendation is something that a lot of people have in mind when it comes to buy or watch something.

The third and last graph shows the age group of those asked the previous question. That graph shows that the 18 to 34 year olds are more influenced by blog and social media, than the older ages were. At the same time, the older people are more influenced by their family and friends.

The third and last graph shows the age group of those asked the previous question. It shows that 18-34 year old are more influenced by blogs and social media than the older ages. While the older people have are more influenced by their family and friends.
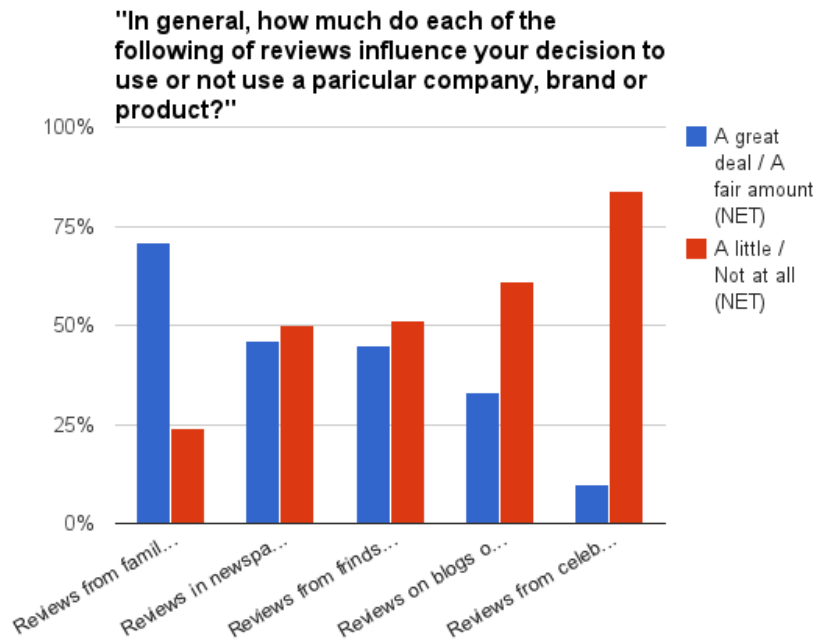
Figure 2.2: 1

2.3 Existing Solutions

According to Alex Iskold, from readwrite.com, there are four approaches for recommendation. The first approach is personalized recommendation which is based on the individual's past behavior. The second approach is social recommendation which is based on the past behavior of similar users. The third approach is item recommendation which is based on the item itself. The last approach is a combination of the all three approaches mentioned above. With these four approaches this section will look at solutions on existing recommendation systems.

The four approaches are:

- Personalized recommendation - recommend things based on the individual's past behavior.

- Social recommendation - recommend things based on the past behavior of similar users.

- Item recommendation - recommend things based on the item itself.

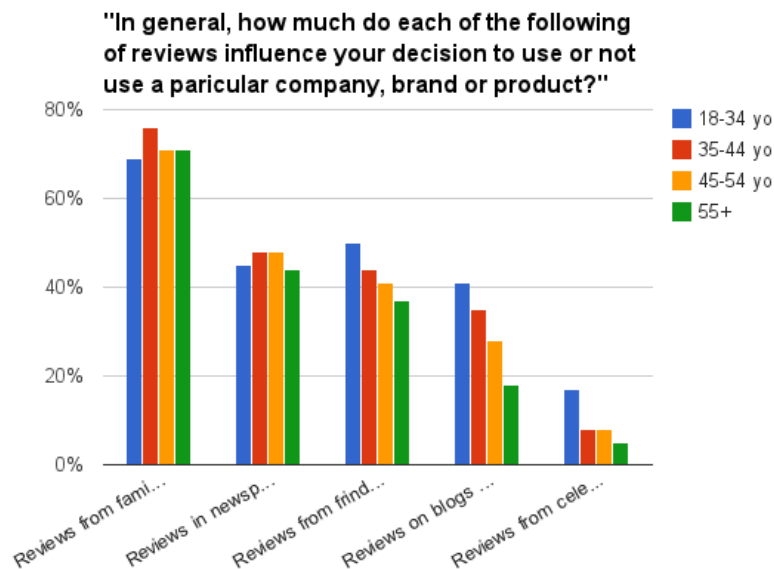- A combination of the three approaches.

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"In general, how much do each of the following of reviews influence your decision to use or not use a paricular company, brand or product?"

Figure 2.3: 1

2.3.1 Solutions

Amazon is the world's largest online retailer. It started as an online bookstore but then it soon got every kind of things like movies, electronics, clothes.

Amazon system uses the combination of the three approaches. Which means the system is based on individual behavior, and either the item itself or behavior of similiar users. Amazon have a "what other customer also bought" under the item you are viewing, which is a social and personalized recommendation. A customer reviews is also possible to be view for the item, where the specific customer is available to rate and comment on the item. And based on the reviews it shows the top 3 similiar statements. Amazon gives you other recommendation based on what your history, which is personalized recommendation

YouTube

YouTube is a popular video sharing website which is under control by Google. YouTube system uses the personalized recommendation. YouTube takes your history, and other activity on the site, to give you recommendations, on which it gives recommendations for channels and videos. So basically whatever video you click on will be placed in your personal history list and based on that it will give you some recommendation.

The problem with YouTube is that even if you only watched one second of a certain video, it will be included in the recommendations to come. Un-

wanted videos can easily be recommended because of this. Channels also gets recommended even after only watching a single video from the channel.

IMDB

Internet Movie Database(IMDB) is database with old to new movies. It gives information about new movie releases and you can be able to watch trailers from the movies before you decide to watch it. IMDB is a kind of personalized recommendation and social recommendation system. The recommendation system goes by the image X

It also has some based on what you've previously seen and rated. The system is to a certain degree, flawed. Despite being sort of a social recommendation, because it is based on what other people have previously seen, there is no friend list or similar, so there is no control regarding what people these social recommendations is based on. The personalized recommendations also has some flaws. As the project groups members tried seeing what it would generate, as a member and not a member of the site, it gave the same recommendations, and showed movies that have already been seen and rated.

LinkedIn

LinkedIn is a social networking website for professional occupations. It is way for people to find, and be found, for projects and/or work based on ones skills, previous experience, and descriptions from other users. It uses text analysis to find certain keywords, like "trustworthy" or "dedicated", to highlight a person's abilities. LinkedIn also has a "apply from LinkedIn" button, where users can apply for a position in a company, through their LinkedIn profile.

The system is based on item recommendation, as it is the descriptions, skills, and keywords extracted about the user, that is used for the recommendation. When the user itself search for a person or a company that will be a personalized recommendation. The system could also be some of hybrid recommendation system There can be some problems, if someone begins to write wrong descriptions about another user, both if it intentionally better or worse than it in reality is.

2.3.2 Overview

The most common recommendation type between the four existing solutions is the personalized kind of recommendations. This is followed by the social recommendation type. Item recommendation is visible on some of the solutions, but is less used compared to the other recommendation types.

Personalized and social recommendations seems to fit into collaborative filtering, while item recommendations falls into content-based filtering recom-

mender systems. To cover all possibilities, a hybrid recommendations seems to be the best option, considering Amazon's success with this kind of recommendation system.

It seems like the personalized and social recommendations is the most important, considering what this project is aiming for. Item recommendation is based solely on data regarding a specific item, rather than a recommendation based on the person's interests, past behavior, and similarities with other people. This will be further investigated in the survey section to find out what people weigh the most, when they receive new media they might consume, or find themselves.

2.4 Connections Between Media

This section is going to be about what possible similarities in attributes there can be between different kinds of entertainment media, as a way to recommend content across them. This is going to look at the content-based recommendation possibilities, which is purely based on data and attributes about the content, like genre and involved people, rather than user and friend ratings.

First we have books, movies, and videogames. These three have a clear connection as they can, and often is, adapted into each other. There exist many movies which is based on a book, like the 'Lord of the Rings' trilogy, and various videogames based on books, like 'The Witcher' and 'Metro 2033' series. For videogames, the other way around is usually a result of rising popularity, and uses novels and books for world-building and secondary plot-lines. Genre is also a clear connection, as all three has the same genres, like crime and science fiction, prevalent through them. Associated people can also provide another connection, like a script writer or director, who previously have worked on both movies and videogames. Television shows can also be fitted into these three, especially movies, who shares many of the same similarities.

For something like music, there isn't any clear connections to any of the previously mentioned entertainment media. Music does appear in the visual entertainment media, like movies and videogames, but mainstream music usually only appear in some movies, and more often than not, movies and videogames has their own scores. Genre connections doesn't apply either, as music has its own set of genres, like rock and pop. For associated people there can be some connections, like if a piece of music shares a composer with a score from a movie. When it comes to books, which doesn't have any music attached to its form of entertainment media, there is even less suitable connections to be

made. It could be argued that there does exist connections between music and books, because for every topic in existence, there will be books about it. Music could appear in books as a story element, or in educational music books. There could also exist connections with biographies depicting the lives of musicians. This is still problematic as these connections are quite niche. This project's topic is also about entertainment media, so something like educational media does not apply here.

A majority of people do listen to some kind of music though, so it could possible, or more suitable, to link users with similar taste in music. Through that music can be incorporated, together with the connections that do exists. This also applies to any other which has already been mentioned, and so, their recommendations can further be reinforced and improved together with their own connections.

Another thing that could provide usable connections can be indirect connections. For example, if you have a certain book, and it has a movie adaption. This movie uses a certain piece of music, which turns out to have variable that match with other media items which the same user likes. This can provide a whole new dimension of connections and recommendations, but also make the recommendation process much more complex.

There exist numerous ways to make connections between the books, movies, and video games, which can be used as parameters for generating content-based recommendations. For music though, there is a clear lack of connections suitable for generating proper recommendations, as it shares minor similarities with movies, videogames, and books. The connections that does exist are quite niche, and may serve more of an educational purpose, than entertainment. It is quite clear though, that music is something a majority of people consumes. So if it can't get as many connections to other kinds of media, it could work in a more social kind of way, where it takes personal information into a higher consideration, and links people who have a similar taste in music, and though that might even recommend a movie or a book.

2.5 Surveys

To find out how people generally perceive media recommendations, it was decided that there had to be collected some data from potential users. For that reason, both an interview and a questionnaire were constructed and executed. This was also done for the purpose of approximating a more precise target audience, and create possible weights based on real data, once the project's

product is going to be designed. This section will look at and discuss the data collected from the interview and questionnaire, and what was learned from doing these activities.

2.5.1 Interviews

Before we decide how to create a media recommendation product, it would be a good idea to figure out, if there really is a need for such a system. Because of that it was decided that there had to be constructed a interview-questionnaire, which could give an idea on if there are any people who would be interested in using a media recommendation website. Besides questions regarding media recommendations, there was also some questions regarding user privacy rights

The project group were splitted into into teams and then discussed where it would be suitable to go, with the area our project is about in mind. The first team went to GameStop and Fona, the second team went to the library, and the third team went to the cinema. The only requirement there was, was that children were not going to be interviewed. The interviewing was conducted with a member of the group approaching a person and ask if they were interested in giving their opinion about different kinds of media. The people who were interviewed did not know the purpose of the questions, until the last question was asked, to avoid people making their opinions out from the idea of a media recommendation system.

Altogether, 15 people were interviewed, all with different ages and jobs/educations. After interviewing, the interview groups met up, and began analyzing all the answers that they had collected from the interviewees. The goal was to find things that the interviewed people agreed on regarding media recommendation, and possibly other information, such as ideas for a possible product. It should also help make clear whether or not a questionnaire survey were required, and if it were, help formalize what it had to achieve.

There was a lot of similarities between the different people who were interviewed. One thing that people especially agreed on, was that they already use similar webpages to what this project had in mind. Another thing that was common about the answers, was that the majority of the people got recommendations from their friends and weighted them higher than critics and other people. However, one surprising thing was that they also weighed their own opinion higher than their friends, even though they haven't seen that movie or book before.

The oldest person who was asked during these interviews was a 52 year old woman, who admitted she most likely would not use such a solution. Besides

her there was a pretty large agreement by people, that such a solution would be a good idea in some way and they would most likely use it. This might suggest that a possible solution would be more suitable targeted at a lower age group. As expected, regarding the questions about user privacy and rights, most people were less secure with their personal information being available for other people, as the amount of the information became more severe. From the interview responses, it could be seen that most people tend to pick up recommendations based on a personalized and social way, rather than through an item recommendation.

The following is a list of other aspects which were picked up during the interviews:

- The majority of people were mostly interested in movies and music as their entertainment media.

- It was desired that it you should be able to see how friends have rated different kinds of media.

- A 'Mood System' were suggested, a recommendation feature based on your mood.

- Recommendations from advertisements or newspapers is used, but is less convenient because it is usually not available on the fly.

2.5.2 Questionnaires

The questionnaire survey was created, mainly, to figure out some more precise weights for how people choose the media they want to consume. So not only as a way to validate the results from the interview survey, but also as variables to implement later in a solution. In total, the questionnaire received 82 responses from 52 males and 30 females. The most dominant age group was the 21 to 25 year olds, which stood for over half of all that answered the questionnaire. This can most likely be attributed to the group members entourage. There was almost an even spread between the different media, with books being the lowest and movies being the highest, in what they use on a daily basis. The questionnaire used a scale from 1 to 5, to rate how high they weigh a certain factor about a certain type of media, where 1 is a low weight and 5 is a high weight.

The questionnaire started by asking three simple questions about how they weigh specifically peoples opinions when it comes to new media, including
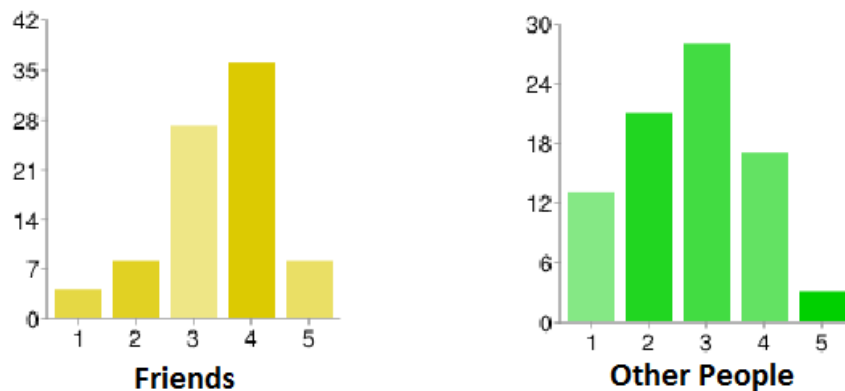
Figure 2.4: Graph showing how much people weigh recommendations from their friends and other people

their friends, strangers, and themselves.. From the responses it is clear that they weigh their friends recommendation higher than strangers, which mainly got a 4, and strangers lower with a 3. The total spread can be seen in 2.4 In the final of the three question it was asked if they weigh their own opinion higher than their friends, and the answer was clear, that they do listen to themselves firstmost, rather than to their friends, when it comes to a new piece of media, which can be seen in 2.5.
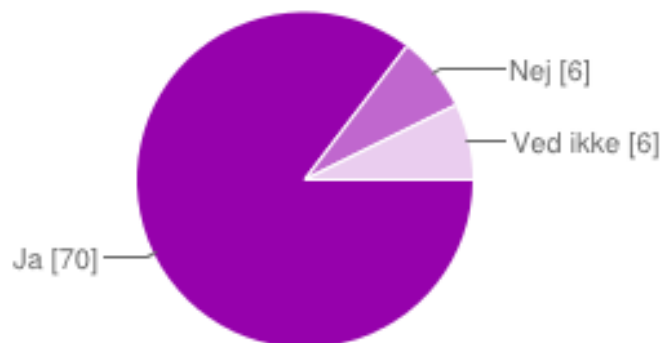

Figure 2.5: Graph showing how many people weigh their own opinion higher that any other people

Then the questionnaire proceeded to ask more specific question about different types of media, namely movies, books, music and video games. It asked

them how high they weigh a certain factor regarding a type of media, like the director of a movie. Something that was present through all the different types of media, was that the genre of the media had a clear high weight, almost universally, when picking a new piece of media. (Her fra og videre giver ikke særlig meget mening) Genre was also clearly superior compared to every other factor for a genre. Besides genre, there was also other, more niche, factors to take into consideration. If we look more directly on the different media we can see that:

Movies:

Factors like who directed the movie had a moderately high weight, together with which actors was part of the cast. These two was the most prominent, where the last one was other associated people.

Books:

For books, besides genre, only the author was asked about. The author had a moderate weight for people, but still seems to be quite important for many people.

Music:

When it comes to music, it seems only the specific performer of the song weights highly, while other associated people have a low weight.

Video Games:

Besides the genre, only which studio made the video game had a high weight. Unlike music and movies, actors and voice actors had a very low weights for video games.

People seems to be looking for trending and know details about a piece of media, like the name of a certain actor or actress, a studio, an artist, etc. Most people seems to favor the more apparent factors of a media, like the actors in a movie, rather than the more obscure, like voice actors in a video game. It is also clear that they weigh their own opinion higher, but still hold other peoples opinions to some regard.

2.6   Target Audience

To find our target audience we first want to examine who might be interested in our potential solution. To do this we have taken several different approaches, first we created personas and use cases to try and get an idea of what groups of people we want to target our program towards. To try and confirm our assumptions, further understand who our target audience is and also define them more accurately, we did interviews.

2.6.1 Personas and Use Cases

Through doing our personas and use cases we got a deeper understanding of who is going to be our target audience. We started by creating personas for three of what seemed like the most obvious users, while constructing situation where our project could might be useful. Along with helping form our interviews it also helped form our program, through showing what kinds of features different audiences might want.

It also helped showing us what age groups we might want to ignore. Because children and people with certain disabilities, particularly bad eyesight, impose certain restrictions on a potential solution, restrictions that is not immediately necessary for our program to function, we have decided to exclude these groups from our initial demands for the program. Note that we consider kids to be everyone younger than 17 years, because that is the oldest age restriction you can find on media(in EU at least). Based on that we have decided to focus our solution towards people in their late teens and people without disabilities.

2.6.2 Interviews

We can see from the interviews that younger people seem to have more interest in our proposed project. One reason this might be the case is because younger people already use the internet to find new media to consume, and most also use other recommendation systems. While our sample size isn't big enough to make a definite conclusion it helped us define questions for our questionnaire, such at the what age groups we should split people into.

The interviews also hint that peoples' current employment status doesn't have a significant effect on their interest in our project. There was one person that outright said she had no interest in our project, and had only one relevant difference from the other people we interviewed which was her age. So that doesn't signify a trend based on employment. And the other 10 interviewees were a mix of unemployed, employed and had various educational levels.

To note about privacy which was a minor focus of the interviews we see that age doesn't really impact concerns on privacy. While younger people were a bit more specific on the technicals and on the different forms of data, they all agreed that they wanted to choose what data the company keeps on them. They also agreed that the data, which the company does not need to run their service, should never be stored.

The interviews not only helped us confirm that there is an interest in the

project but also to specify our target audience. We now know that our focus should be towards the age group 18-50, based on the responses we got.

2.6.3 Questionnaires

The questionnaires showed that all age groups have, to some degree,an interest in some kind of media. All age groups also seems to put more weight on the more apparent aspects of a piece of media, like the cast or the artist, and especially the genre. The same also seems to apply to how much they weigh whether or not a recommendations is from a friend, and their own opinion.

There was an overabundance of responses from the 21-25 age group, which can most likely be attributed to the group members entourage. It could be seen though, that generally, as the age group became older, the responses seemed to turn more apathetic. Still, it is hard to determine a precise age group, since responses from more older people is scarce, and there isn't enough responses to confidently determine anything. It does help validate that there is an interest among younger people.

2.7   User Privacy and Rights

For a recommendation system it is required to collect data about the intended recipients of the recommendations. The recommendations become better and more precise, as the amount of data becomes bulkier, so a recommendation system will usually try to gather as much it possibly can. This can also be called data profiling, where the intended system for this project would categorize people depending on their taste in media, personal information like age and sex, and their common friend connections. In other instances it could might also include variables like previous purchases, view history, tags, and keywords extracted through text analysis. All of these might be more revealing, and raises privacy concerns.

Even with this amount of data gathering this project plans to handle, there will be some data privacy concerns. Users will most likely be required to register a profile or account to utilize the system, and will have to hand over personal information for verification and recommendation purposes. This is of course not any different from many other systems who does the same thing. But in this case, we're talking about a recommendation system, which poses some new challenges in this aspect. Because recommendations can be based on the data of other people, it would make it possible to deduce connections

to other people. Especially if it is through some uncommon element, like an obscure cambodian film, where fewer people is connected to. This can ultimately lead to personal information being found out. This risk is further heightened if the person also has access to the database, and can place queries.

This is a glaring challenge for any recommendation system, but is also a complex and difficult problem to solve, or even answer to. It also depends on exactly how this projects product is going to be constructed, which is not yet formalized, to properly answer these questions. At this point it might be out of this project's scope.

We conducted some interviews where we asked potential users several questions regarding the project, including questions regarding how much information they would be okay with being available, either to a company or the entire public. The questions was asked in a rising degree, to see exactly where people's threshold would be. Most people were okay with their contact information being available, as it was most likely already available in some form of way. When it came to their more personal information, like interests and age, they were more uncertain. Almost all was okay with having their very personal information, like emails, chats, and pictures, available, as expected. An interesting feature a lot of them mentioned were an option to choose whether or these information was shared, for the user themselves. This could be a more user-engaging way to collect information for the recommendation system, and solves most problems regarding user rights, as the user decides for themselves what they want to share.

2.8 Project Boundary

This section is going to make a boundary on the width of this project's problem area, based on the previous problem analysis. This is done to limit the project to what is the most important, which is based on survey results, and other information collected or augmented throughout the problem analysis.

Through the surveys that was done, both the interview and the questionnaire, one of the goals was to find out what kind of recommendation has the highest appeal for most potential users. There was three kinds of recommendations which was evaluated; Personalized, social, and item. Looking at responses generated with the surveys, it became apparent that social was the dominant kind. Followed by personalized, realized with recommendation sites like IMDB, and lastly item recommendation. Recommendations based around the person itself, and its nearest social bonds, seems to be the most common

kind of recommendation. Based on this, the project will be limited to focus on social and personalized recommendations. For a completely finished recommendation system, a hybrid of all three should be considered, including item recommendation, as it has its own useful features.

Regarding what kinds of media should be included in the project, the answer is not quite as clear. It was augmented for in section [REF] that there exist clear connections between books, movies, and video games, while music was the odd one out between the four. But, since it has already been made clear that the project will be based on social and personalized recommendation, this becomes less of an issue. With this the recommendations will not be generated purely on attribute connections between media, but by data collected from users and their connections to other users. Survey results from the questionnaire also back up this stance. Despite this, it is necessary to limit the project to gain more simplicity, as recommender systems is already quite complex. In a finished product it is expected that all entertainment media forms is included, but for this project, music is going to be excluded for initially reducing the workload.

Early in the project it was considered that issues like user privacy and rights was to be tackled in this project, since a recommendation system uses personal information regarding its users to generate recommendations. As expected, the interview survey further backed up this stance, as most people who were asked were less secure with their personal information being used without their consent. A possible method was suggested in section [REF], like giving the user themselves the possibility to choose whether or not they give consent to using their personal information, with less accurate recommendations as a consequence if they should decline. Despite this, the problem with user rights is difficult to answer, as it is quite an ethical problem, and therefore out of this project's scope. For this reason, user privacy and rights will not be looked at further in this project.

The precise target audience for this project is hard to set, as entertainment media is something almost any age group consumes to some degree. What has been determined is that the project will not cater to children, and therefore no entertainment media specifically targeted towards children. This is done to prevent making the designing process more difficult, as the product would have to cater to children otherwise. You could imagine that the site could be used by parents to find children entertainment media to enjoy with their children, but for now, the project will be limited away from this kind of feature. People with physical disabilities, or other disadvantageous which prevents normal use of personal computers, is also not included in the target

audience. This is done for the same reason as children.

A more precise age group for the target audience can be specified by looking through survey results. In the interview survey, a 52-year old interviewee showed disinterest in the overall concept of this project, and was less aware of recommendation possibilities that can be generated through websites like IMDB. This trend became more apparent depending on how old the interviewee was. The questionnaire survey showed, as expected, that all age groups has some form of interest in entertainment media. Still, the exact age group is hard to set, but considering what has already been stated regarding children, the lower bounds of the target age group can be set to around 17 years. The upper bounds is less clear, and can be set from anywhere between the 30'ies to the 40'ies. These bounds is put in place to figure out who the possible solution should be designed for, rather than what entertainment media can be excluded, as even a fifty year old movie can still be popular today.

2.9 Problem Formulation

2.9.1 System Definition

An IT-system used to recommend new media content, based on previously watched content, and other factors like trending or the interests of friends. The system is mainly a recommendation system, but can also function as a way to introduce an user to other kinds of media. There is also minor aspects of a social media system, like a friend list. The system must be based on a website, and can therefore be accessed from any device with a suitable browser and internet connection. The system is going to require a wide array of users, user data, and media data, to generate better and more precise recommendations.

2.10 Product Requirements

For this project there is going to be prepared an object oriented solution, in the form of a program, which allows a person to list media which he or she has consumed, and then receive recommendations for new pieces of media, based on previous behavior. The system should be approachable, but will have a focused target group from the late teen years into the thirties. The system should function as a way to manage and keep track of previously consumed media, but also as a way for the person to discover new media, based on the recommendations the system generates. Besides data collected from the users

previously watched media, which is content-based recommendation, there is also going to be recommendations based on other people who also use the system, which is collaborative recommendations, making it a hybrid recommender system. The product is also going to prepare a fitting graphical user interface, in the form of a web page.

- Functional Requirements

  - It has to be possible for the prototype to generate recommendations based on a hybrid recommender system.

  - The prototype should have a fitting graphical user interface for the chosen target audience.

  - The prototype has to be usable, and as a minimum, be able to run locally on a regular desktop PC with an internet browser, e. g. Google Chrome.

  - The prototype should implement a rating system, where indicate their satisfaction with a piece of media based on a scale from e. g. 1 to 5.

- Non-Functional Requirements

  - The prototype, together with the associated project report, have a shared deadline the 21th of December 2013.

  - The prototype has to be written in the C# programming language, following object oriented programming.

  - The prototype and the project has to support the requirements and learning goals which the curriculum prescribe.

- Solution Goals

  - The hybrid recommendations should help the system create more correct recommendations, by applying both content-based and collaborative recommendation.

  - It should be possible for recommendations to be across different kinds of media, e.g. from data regarding movies into a video game recommendation.

  - Recommendations should have additional weights added, to favor certain aspects of a media like which person it originated from or preferences, based on survey results.

– It should be possible for the users themselves to alter the recommendation process, to some degree, through preferences and indicating unwanted factors in a piece of media.