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Exploring the Effects of Language Skills on Multilingual Web Search

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Abstract. Multilingual access is an important area of research, especially given the growth in multilingual users of online resources. A large body of research exists for Cross-Language Information Retrieval (CLIR); however, little of this work has considered the language skills of the end user, a critical factor in providing effective multilingual search functionality. In this paper we describe an experiment carried out to further understand the effects of language skills on multilingual search. Using the Google Translate service, we show that users have varied language skills that are non-trivial to assess and can impact their multilingual searching experience and search effectiveness.

Keywords: Cross-language web search, user study, design, language skills

1 Introduction

As globalisation and the Internet have facilitated the exchange and accessibility of ideas and information in a variety of languages, the field of Cross-Language Information Retrieval (CLIR) has emerged as an area of focus in the IR community. Many experiments have been conducted under the Cross-Language Evaluation Forum (CLEF¹), mostly focusing on evaluating the retrieval of news articles from an unknown language collection based on a query submitted in a user's native language.

However, in reality, individuals' needs are not always so simplistic or limited only to this type of situation. There are other scenarios in which cross-language information requirements can vary. For example, users may wish to access multilingual material that is not plain text (e.g. web pages or images). Furthermore, with regards to language skills, individuals can have a range of both passive (e.g. comprehension) and active (production) abilities based on their mother tongue and other languages they may have studied for any length of time.

The present experiment was designed to expand upon previous CLIR research by focusing on the role language skills play in a multilingual web searching context, whilst also considering the importance of other factors inherent to the interactive search process (such as user satisfaction). Participants were asked to find a variety of web pages in three different languages: their native language, one that could be passively understood, and one that was completely foreign. The Google web search

¹ <u>http://www.clef-campaign.org/</u> (site visited: 06/01/2008)

engine and associated Google Translate² service for search results were chosen as representative systems for testing. Search behaviours, functionalities used, and overall performance was compared in each of the three language conditions. As expected, many of these varied depending on the target language and the type of query submitted. However, the findings provide useful input into future design of cross-language support in information retrieval systems.

2 Background

Any study examining cross-language search must consider its users' language skills. Unknown and native languages are the two endpoints of a spectrum of language knowledge; foreign language ability can vary greatly within these two extremes. While Ringbom [1] points out the distinction between passive and active ability, Laufer & Goldstein [2] suggest that this dichotomy is too simplistic, and propose a continuum of knowledge strength that also includes recall and recognition. According to Gibson & Hufeisen [3], prior knowledge of a language has been shown to assist understanding of an unfamiliar but related one (e.g. German and Swedish).

As argued by Gonzalo [4], there are two different situations relating to a user's language skills that carry different design implications for cross-language systems. If a user is monolingual, full translation assistance is needed in a CLIR context (e.g. back translation of query terms and document translation). If the user has some passive language skills, then document translation is less likely to be used or desired. Language ability, therefore, is an important variable to consider when designing a system that will cater to a range of users with different needs.

Other studies have focused on user behaviour when performing cross-language search for text or images. Zazo Rodriguez et al. [5] examined the effect of users' language abilities on the types of functionalities they used for a question-answering exercise. Compared to individuals with "good" foreign language skills, users with poor skills were found to be more likely to enter queries in their native language and then have them automatically translated to the document language. These "poor" users were also more likely to use and appreciate a functionality which translated the document summaries into their native language.

Petrelli et al. [6] also acknowledged that users are not always monolingual and looked beyond this typical view by investigating how polyglots interacted with a cross-language text retrieval system. However, completely bilingual users with excellent language skills were studied, and thus little insight was given into how the system could have served users with moderate or passive language abilities.

Artiles et al. [7] studied which CLIR functionalities were employed when searching for images with a system that offered three query translation options: no translation, automatic translation, and assisted translation (where the machine translated result could be viewed and edited). Translation was typically selected in cases where the search was precision-oriented and geared towards finding something specific. Overall, the assisted translation mode was the most popular, although the

² <u>http://www.google.com/translate_s?hl=en</u> (site visited: 06/01/2008)

possibility of changing the default translations of the system was largely unexploited (perhaps partly due to the tasks assigned).

Research by Kralisch & Berendt [8] found that the linguistically-determined cognitive effort involved in processing information in a foreign language can be mediated or lessened in cases where domain knowledge is high. Similarly, Gaspari [9] asserted that some users may understand specialized terms relevant to their field of interest, even if their general foreign language ability is limited.

Other studies have looked at how users interact with cross language functionality, even if language skills are not explicitly considered as a variable. Dorr et al. [10] noted that letting users edit machine translated output led to a more satisfying overall experience (although this control was still not as effective as query reformulation). What this study did not examine, however, was the role that knowledge of the target language played and how this could have affected users' behaviour.

To examine the best way of displaying machine translations to a monolingual user, He et al. [11] tested two different approaches: pure back translations and more contextual translations (showing the keyword in the context of a sample sentence). Overall, the potential utility of each approach was deemed to depend on factors such as the characteristics of the topic, the collection, and the translation resources. Even if query translation is offered, it may not necessarily be used if it is not perceived as providing some benefit. For example, research conducted as part of the European TRANSLIB project revealed "people made little use of the title translation capabilities in TRANSLIB because they tended to use the system only to find documents in languages that they could read." (cited in [12]).

Many of the aforementioned studies focused on individuals searching for text-only articles. Web pages are different from texts because they often contain images or other cues to help provide additional (non-verbal) information about the content. Little is known about how people may conduct cross-lingual search using mainstream Web-based systems, especially in a variety of languages; hence, these areas will be the focus of the present investigation.

3 Methodology

Due to time and resource limitations, 12 participants were involved in this study. They were predominantly computer science postgraduate students or researchers with a mean age of 30 years and a median age of 27.5. To investigate the influence of cross-linguistic similarity, individuals with Romance language skills were specifically recruited. Because these languages share a common origin; it was assumed that each participant would have some latent, interchangeable passive knowledge of the others.

Five of the participants were native (or near-native) speakers of Spanish, four of Portuguese, two of French, and one of Italian. Before starting, participants completed a questionnaire relating to search engine use and reading/writing ability levels in all languages with which they had experience active (L1), passive (L2), and unknown (L3) languages. L1 was counted as the native language or a language spoken at near-native fluency. L2 was defined as a Romance language similar to the individual's L1, but for which their self-rated reading/writing abilities were "beginner" or below. L3

was a language the participant could not understand, selected at random from the possibilities of German, Japanese, and Russian. Three options were necessary because some people were familiar with at least two of the languages.

The Google Translate "search results" translation service was used for these experiments. It was chosen over other similar systems because Google's search engine draws upon a large index, and its widespread use means it is familiar to most individuals. This system provides a wide range of functionalities, including automatic query translation, snippet translation, web page translation, and possibility of viewing and editing the query's translation. As such, it provides the set of "ideal" cross-language search functionalities advocated by Zhang & Lin [12].

Participants were asked to imagine they were high school teachers looking for web pages to show non-English speaking students. They were given a list of topics and asked to find and bookmark 3 relevant pages for each one (within a set time of 5 minutes for each topic). To find this information, they could use the Google search engine (including any localised versions, e.g. google.es) or the Google Translate site. None of the participants had used Google Translate before; therefore, the basic functionalities and features of the site were demonstrated to them beforehand.

There were 12 topics in total (4 for each language). This study was conducted in the context of a project focusing on cultural heritage and designed to focus on the common behaviour of focused web search. Search topics were chosen from a list of popular queries submitted to cultural sites, ranging from proper names and titles (e.g. Hamlet, The Last Supper) to more general subjects (modern art, still life) and fairly specific terms (Gothic cathedrals, Etruscan tombs). Half of the topics were considered "hard" for translation (that is, they were incorrectly translated by Google Translate), and half considered "easy" for translation. Hard topics were not always identical across languages because the automatic translation system did not make the same types of mistakes in all languages. Nonetheless, types of errors leading to hard queries had characteristics corresponding to one of three main categories of "performance issues" in CLIR (cf. [13]): lack of coverage (out of vocabulary terms - e.g. Etruscan,) translation ambiguity (Hamlet being translated as "small village" instead of the title of a play) and incorrect translation of phrases ("still life" translated word-for-word).

The language orders and the task-language combinations were assigned based on a Latin-square arrangement, with 2 hard and 2 easy topics for each language. After each set of 4 questions (one language set), the participants filled out a brief questionnaire to assess the difficulty of the task and their confidence with finding relevant sources for each topic. At the end of the experiment, participants filled out a language test for their passive language to assess the correspondence with their self-reported levels. They were also asked to rate the usefulness of functionalities of Google Translate and comment on potential future improvements to the system.

4 Results

4.1 Languages Used for Web Search

Except for one individual, none of the participants were native speakers of English. However, they reported using English to search on the Internet between 48 and 95% of the time (mean 75.5%). This may be because all participants were currently studying or working in the UK and therefore may have needed to, grown accustomed to, felt more confident, or had more success using English to search on a regular basis. Responses indicated that users predominantly search in English or their native language, using other foreign languages relatively infrequently.

Foreign language abilities in reading and writing were self-reported on a scale from 1 (beginner) to 5 (advanced). Across all responses in all languages, the mean value of reading skills (3.59) was slightly higher than that of writing skills (2.96), suggesting that people judged themselves to be better at reading than at writing (this difference was not statistically significant).

Table 1. Frequency of use of Google Translate functionalities for each topic, by language

	Query translation	Translated query editing	Original links viewed	Translated links viewed	Both links viewed
L1	13 (27.1%)	0	4 (8.3%)	1 (2.1%)	1 (2.1%)
L2	37 (77.1%)	3 (6.3%)	26 (54.2%)	2 (4.2%)	4 (4.2%)
L3	46 (96.0%)	0	14 (29.2%)	19 (39.6%)	9 (18.8%)

As shown in Table 1, reliance upon query translation functionalities increased with language unfamiliarity: users were more likely to look at the translated versions of pages for L3, and the original versions for L2. Query editing occurred only 3 times out of all 144 topics, and these were exclusively in the L2 condition. Based on the tools available (which offered limited editing assistance for translated queries), users were much more likely to reformulate or edit the query in the source language than to deal with the machine translation, behaviour also noted by Dorr et al. [10].

Table 2. Number of topics searched with each site, by language

	Google only	Google Translate only	Google and Google Translate
L1	35 (72.9%)	4 (8.3%)	9 (18.8%)
L2	9 (18.8%)	15 (31.3%)	22 (45.8%)
L3	2 (4.1%)	26 (54.2%)	20 (41.7%)

4.2 Sites and Functionalities Used

In general, as language unfamiliarity increased, the use of Google Translate also increased. Many searches were conducted with a combination of Google and Google Translate (Table 2). Often, participants switched from one to the other after a few unsatisfactory query modifications, thinking that the second system would yield different results (in reality there was no difference; Google Translate results were the same as those obtained from using Google). Because the search topics were given in English, 27.1% of participants utilized Google Translate in the L1 condition to find (or verify) the corresponding term in their native language.

4.3 Performance Measures

The following quantitative measures were used to assess user performance on the tasks: **Relevant Items**: the number of pages bookmarked (0-3); **Time**: the length of time taken to do so; **Modifications**: the number of times the query was modified (something else was typed into the search box) per task; **Links viewed**: the number of page links selected (in original language and in target language); **Percent Chosen**: the number of links bookmarked as a proportion of total links clicked on; **Success**: a relative indication of how easy the task was, determined by dividing the number of bookmarks by time (a higher number means the person was more "successful" at completing the task); **Difficulty**: a rating of task difficulty supplied by the user (this referred to all four searches for a given language) (1=very difficult, 7=very easy); and **Confidence**: a rating of user confidence that sources found were relevant (1=not at all confident, 7=very confident).

Perhaps not surprisingly, more people successfully completed the task of bookmarking three pages in the L1 condition (67%) as opposed to the L2 and L3 conditions (33% and 19%, respectively). Within each language, more bookmarks were made for the easy topics than the hard topics. However, nearly 30% of participants found three bookmarks they felt were relevant using easy queries in the L3 condition.

Language Effects

A one-way ANOVA was carried out to determine the effect of search language on the quantitative measures mentioned above. The tasks in L1 were self-rated as significantly easier than those of L2, which were in turn rated as significantly easier than those of L3. The significant differences between the language groups with respect to mean values for relevant items found, time, percent chosen, success, and confidence were between L1-L2 and L1-L3 (as highlighted by the letter superscripts in Table 3). The differences in time and success seem to be in accordance with findings by Kralisch & Berendt [8] that non-L1 information processing requires more cognitive effort than L1 information processing.

Subsequent ANOVA analysis comparing these measures across the L3 conditions yielded no significant differences across performance measures, although German search was rated as significantly easier than either Russian or Japanese search (due presumably to the more familiar alphabet). German searchers were also significantly more confident in their findings than Russian searchers.

Table 3. Effects of search language on various measures.

Measure	Language	Mean	Sig.	
Relevant Items**	L1	2.458 ^{ab}	^a =.001	
	L2	1.646 ^a	^b =.000	
	L3	1.437 ^b		
Time**	L1	3.985 ^{ab}	^a =.002	
	L2	4.584 ^a	^b =.000	
	L3	4.766 ^b		
Modifications	L1	1.655		
	L2	2.000		
	L3	2.313		
Links Viewed	L1	4.479		
	L2	4.333		
	L3	3.812		
Percent Chosen**	L1	0.588^{ab}	^a =.006	
	L2	0.395 ^a	^b =.010	
	L3	0.408 ^b		
Success**	L1	0.7193 ^{ab}	^a =.000	
	L2	0.4077 ^a	^b =.000	
	L3	0.3433 ^b		
Difficulty**	L1	5.667 ^{ab}	^a =.000	
•	L2	4.000^{ac}	^b =.000	
	L3	3.167 ^{bc}	^c =.003	
Confidence**	L1	5.958 ^{ab}	^a =.000	
	L2	4.213 ^a	^b =.000	
	L3	4.106 ^b		

**differences significant at p<.01

Effects of Topic Difficulty

An independent samples t-test was performed to compare mean results between easy and hard topics (see Table 4). Significant differences were found between these two groups with respect to the number of pages bookmarked, number of query modifications made, success, and confidence. The significantly reduced number of modifications made for easy queries corresponds with an assertion by Och et al. [14] that better quality machine translations result in reduced post-editing effort.

The effect of topic difficulty on confidence was also significant on the results for L1, L2, and L3 when analysed separately using independent samples t-tests (see Table 5). Within each language, users were significantly more confident with the results they found for the easy queries as opposed to the hard queries. This easy-hard distinction also emerged, surprisingly, in the L1 condition (in which occurrences of query translation were much lower). Since Google Translate exploits the web as a parallel corpus, perhaps what helps to make a query easily translatable or not is influenced by the number of pages available on that topic. If the hard topics were less well represented even in English, then the likelihood or speed of finding relevant results could be reduced compared to more popular, "easy" topics. There was no significant interaction between language and difficulty.

Table 4. Effects of topic difficulty on various measures.

Measure	Topic type	Ν	Mean	Sig. (2-tailed)
Relevant Items*	Е	76	2.105	.003
	Н	68	1.559	
Time	Е	76	4.310	.061
	Н	68	4.596	
Modifications*	Е	76	1.526	.000
	Н	68	2.500	
Links Viewed	Е	76	4.461	.065
	Н	68	3.927	
Percent Chosen	Е	76	0.506	.078
	Н	68	0.414	
Success*	Е	76	.5678	.016
	Н	68	.4033	
Difficulty	E	76	4.408	.303
	Н	68	4.132	
Confidence*	E	76	5.461	.000
	Н	68	3.970	

*differences significant at p<.05

Table 5. Mean confidence rating for easy vs. hard topics, by language.

Language	Topic type	Ν	Mean	Sig. (2-tailed)
L1*	Е	28	6.393	.007
	Н	20	5.350	
L2*	Е	24	5.083	.002
	Н	23	3.304	
L3*	Е	24	4.750	.024
	Н	23	3.435	

*differences significant at p<.05

Quantitative Measures from Final Questionnaire

The average mean ratings of the usefulness of the three translation aids offered by Google Translate ranged from 3.90 for query editing to 5.08 for query translation to 5.50 for translated snippets (with 7 being most useful). The rated usefulness of the various features corresponded with their frequency of use (as shown in Table 2). That is, since both query and snippet translations were actually used more often than query editing, it is not surprising that they were also rated as more useful.

The usefulness ratings of the various functionalities (query translation, snippet translation, and query editing) varied based on the language being considered. For non-native languages L2 and L3, opinion on the most useful feature was split equally between query translation and translated snippets. The mean usefulness ratings of proposed additional functionalities (dictionary support and greater control over the query) were 6.25 and 5.41, respectively. However, dictionary support with back translations or pictures was viewed as more helpful than just showing the alternative translations in the target language with no further explanation or assistance.

Passive Language Reading Test

The final element of the questionnaire was a short analytic test of basic passive L2 reading ability. Only reading comprehension abilities were tested since this was deemed to be the main skill being tested in the experiment (the ability to skim and understand the content of the results summaries and the web pages). This was adapted from the BBC Languages site³ and consisted of 12 questions of increasing difficulty. Scores on these tests (taken in French, Italian, or Spanish), ranged between 6 and 12, with a mean value of 8.4. It should be noted that none of the participants self-reported any knowledge of the L2 they were assigned.

Comments and Observations

Responses to the post-experiment question: "Would you use Google Translate again? Why or why not?" revealed three common attitudes:

- 1. Not a useful tool (5): "Interesting tool but not sure I need to use it", "Just when no other means to get the information are available."
- 2. Helpful in some situations (4): "Useful to translate words into different languages" "The searching environment is very useful"
- 3. Translation quality could be improved (3): "I'm not quite sure about how accurate the translations were." "It's not very reliable when doing translations"

What emerges here is a feeling that many people could not normally envision a reason to use a system like Google Translate. However, none of them were aware of the system's existence prior to using it in the study. They may have not realized its potential use in some situations (i.e. when planning foreign travel, to broaden the scope of a search, etc). The experiment by its very nature created a somewhat artificial, restricted situation in which users were only allowed to use two specific sites. It is unclear to what extent they would voluntarily use (or need to use) Google Translate in their everyday search behaviour. Further research could examine this question in a more open-ended and naturalistic context.

Other observations made of search behaviour indicate that people using a machine translation system expect it to operate in the same way as an ordinary search engine (with regards to query syntax and formulation). In the case of Google Translate, this was not so. Adding quotation marks to mark phrases and refining queries with supplementary terms, while conventions for Google search, did not have an effect on the machine translation system. Individuals employed creative strategies to find information when the Google Translate results were unsatisfactory. For example, some users were seen to exploit the multilingual structure of Wikipedia pages. This was carried out to bypass the potentially inaccurate query translations of Google.

This suggests that the automatic translation, while beneficial, still produces many errors (and this was recognized by the users). The means of dealing with these errors was not sufficiently developed in Google Translate for the "hard" queries, leading to a

³ <u>http://www.bbc.co.uk/languages/ (site visited: 06/01/2008)</u>

lower level of search precision. It should be noted that shortly after the present experiment was conducted, a dictionary service was added to the Google Translate pages to allow the lookup of words or phrases in a limited set of language pairs. This no doubt can help the user to identify the correct translation for their query. However, the dictionary service is located in a separate tab and thus is still not as user-friendly as it could be if it were integrated into the main "translated search" interface or integrated into the search service to seamlessly display alternative translations.

5 Discussion and Design Implications

Overall, it was encouraging to see that given the appropriate tools for assistance, people can still find basic relevant information in a partially or completely unknown foreign language. Despite this, however, there are clear differences in the level of functionality required from a CLIR system based on the users' language skills. This is in line with the findings of Gonzalo [4]. The main observations (and implications for improved system design) included the following:

- A query-editing feature does not appear to be helpful for L2 and L3 conditions if editing assistance is not provided. Users with passive reading skills (L2) still struggle to write queries themselves and therefore may not be able to correct a translation they identify as erroneous.
- Suggestions of alternative terms are needed when a query is ambiguous or incorrectly translated (e.g. dictionary support is needed to supplement "pure" machine translation). Depicting terms pictorially (language-independently) is a novel idea that warrants further investigation.
- Both query and document translation is essential when a user searches in an unknown language. The former of these is still important when an individual has passive knowledge, although the need for the latter may be less.
- Users employ the same strategies for search with or without query translation and expect that adding extra query terms or using common web search query syntax (e.g. using quotes to mark phrases) will be effective in a query translation situation as well. Such syntax should therefore be supported.
- Searches are more successful when the query terms are correctly translated; therefore, the continued improvement of machine translation is important.
- Users are not always accurate reporters of their own language abilities and tended to under-estimate their passive skills in this experiment. Creating personalised CLIR interfaces (based either around results of an objective test or on a self report) could help to appropriately target support to users based on their spectrum of knowledge.

6 Conclusions

This study expanded upon previous work in cross-language information retrieval by examining the effect of language skills on web search behaviour using Google Translate. Whereas the majority of CLIR-based research has focused only on how people retrieve material in unknown languages, the present study indicates that many individuals also have passive language skills. They behaved closer to native language ability when using a passive language as opposed to one that was unknown, although these differences were not statistically significant. Overall, as might be expected, the perceived and actual difficulty of the task increased as language unfamiliarity increased. However, the accuracy of query translation also seemed to have an effect across all the language conditions, so that it was harder to find relevant information (in any language) for queries that were incorrectly translated. This problem was further compounded when queries were modified by adding extra terms.

One limitation of the study may have been the five-minute time limit for each task. While this was put into place to reduce fatigue effects and keep the experiment down to a reasonable length of 1.5 hours, some users felt it was "artificial" and it may have led them to bookmark some less appropriate sites just to feel that they were able to complete the task in time. Whilst Google Translate was clearly able to provide enough support to help participants locate at least some relevant material in both passive and unknown languages, there are ways in which it (or any similar cross-language searching system) could be improved. Aside from creating translation systems that produce fewer mistakes, it would be beneficial to offer: (1) phrase recognition and translation (either automatically detected or manually indicated) and (2) integrated dictionary support to identify alternative translations for ambiguous terms, with some means of displaying these in an understandable way.

As the associated pictures and visual cues of the web pages helped the participants to make relevance judgments, future work could focus on cross-language functionalities that would assist users searching for other types of media (e.g. images or video), as these may differ from those used in a purely text-based situation. Overall, the present experiment provided insight into the behaviours and strategies of individuals searching for material in a variety of languages. Findings can help to influence the design of personalized cross-language searching support based on an individual's varying abilities and language needs.

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