



# 行政院國家科學委員會專題研究計畫成果報告

依據概念的中英雙語對應句檢索系統

Towards a Concept-Based Chinese-English Translation Retrieval System

計畫編號：NSC 90-2411-H-002-043

執行期限：90年8月1日至91年9月30日

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**中文摘要** 本計劃利用同義詞及中英平行語料庫來建構一個翻譯檢索系統。此系統將輸入的中文句子先經過分詞，之後計算每個詞在各文件出現的平均次數 TF (term frequency) 及所有文件數中出現該詞的文件數的反比 IDF (inverse document frequency)，除利用  $TF * IDF$  計算每個詞的權值，並利用同義詞作為 query expansion 從平行語料中擷取與輸入中文的句子概念相近的中文句子及其對應的英文翻譯並依照權植高低依序排列。

**關鍵詞**：概念檢索，翻譯檢索，雙語對應句檢索，中英平行語料庫，電腦輔助翻譯，電腦輔助語言教學中英檢索

**Abstract** : We develop a concept-based Chinese-English translation retrieval system which can take a Chinese sentence as input and extract synonymous Chinese sentences and their English translations from parallel Chinese-English corpora. Drawing on a Chinese-English parallel corpus, the system performs word segmentation for Chinese input sentence and employs  $TF * IDF$  (term frequency \* inverse document frequency) for calculating the weighting of each word. Using term weighting and a Chinese thesaurus for query expansion, the system is capable of retrieving and ranking synonymous or conceptually similar Chinese sentences along with their English translations.

**Keywords** : conceptual retrieval, translation retrieval, bilingual concordancer, parallel Chinese-English corpora, computer-assisted translation, computer-assisted language learning,

## Introduction

Bilingual concordancers are powerful tools for language learning (cf. Barlow (2000), Nerbonne (2000), John (2001), Wang (2001)). Combined with sentence-aligned bilingual corpora such as the English-French Parliamentary Corpus Hansard, they allow language learners to retrieve sentences containing an input keyword along with their translations. Moreover, they can accept queries in two languages. This greatly facilitates the

retrieval of unfamiliar expressions for language learners in reading and writing. When encountering unfamiliar words or phrases in a foreign language, learners can understand the meanings by inputting these words and looking at the translation examples containing the input words. Similarly, they can learn how to express themselves in a foreign language by inputting an expression in his/her native language and inspecting the translation examples. The potential help of bilingual

concordancers to language learners is enormous.

Unfortunately, some of the limitations prevent learners from making the best use of them. Due to the scarcity of sentence-aligned parallel corpus, keyword-based pattern match technique that works with short query is not suited to a longer query such as a clause. A typical dilemma language learners face in using a bilingual concordancer is that the longer the expression they input, the less likely it is to find its translation in the bilingual corpus.

In this project, we propose to resolve this problem by using concept-based rather than keyword-based retrieval technique. Our proposed method can take a keyword, phrase, or sentence in the source or target language as input and retrieve the closest translations if no translation equivalents of the input expression are found. Central to this technique is the formulation of a measure for semantic similarity based on thesauruses and the calculation of term weighting of the input query. The proposed method, largely inspired by recent researches in computational linguistics, is implemented as a web-based program employing a Chinese-English parallel corpus and used by students of freshman English for evaluation. Our study shows that such a tool significantly outperforms conventional keyword-based bilingual concordancers. The limitations of this approach and direction of future research is also discussed.

### **Sentence Alignment**

The origin of a bilingual concordancer may in part be attributed to a technical report by Martin Kay at Xerox in 1980, which was not published until 1997 (Kay (1997)). In that seminal paper, Kay proposed a computer-aided translation system which can access previous translation examples created by professional translators. Similar idea was reintroduced by Harris (1988), who suggested using “bitexts” (i.e. translation equivalents coupled together unit by unit) as a computer-aided tool for professional translators. It was not until the mid 1990s that Kay's idea was finally realized (cf.

Dagan and Church (1997) ) Unfortunately, this kind of powerful tool is not widely used in Taiwan. Part of the reason is that it presupposes the correct identification of bilingual correspondences of the source and target language at the sentence level. In computational linguistics, this procedure is called sentence alignment and has been actively researched in recent years. Approaches to sentence alignment can be categorized into statistics-based (Brown et al. (1991), Church and Gale (1991, 1993), Kay and Roscheisen (1993), dictionary-based, and hybrid method (Kumano and Hirakawa (1994), Haruno and Yamazaki (1996)), none of which performs well in Chinese-English bilingual corpora according the experiments reported in Gao (1997).

A simple method to circumvent the problem of sentence alignment is to look for bilingual texts where there are clearly identifiable markers for text alignment. The internal structure of Bible makes it a good resource for aligning texts at paragraph level, because each paragraph (more precisely passage) in Bible is marked by a numerical indicator. The difficult task of text alignment is thus simplified to matching numerical indicators in the English Bible and the Chinese Bible.

Another important Chinese-English bilingual resource is Sinorama Magazine. Articles in the Sinorama Magazine are written in Chinese and translated into English, Spanish, and Japanese. The English translations are all checked by native speakers of English. The Chinese-English bilingual resources provide important resources for Chinese learners of English who wish to learn English expressions related to Chinese culture or events that takes place in Taiwan.

Sentence alignment in the Sinorama bilingual magazine is complicated by several factors. As with most translations, additions and omissions of sentences or even paragraphs are quite common in the Sinorama magazine. Another difficulty is caused by the abundance of nonliteral translations in the Sinorama magazine. These suggest that a hybrid approach

combining statistical and dictionary information is a better choice. We first use Church and Gale's algorithm to derive the initial sentence correspondences in the Chinese-English bilingual corpus. The method is based on the assumption that a longer sentence in the source text tends to be translated into a longer sentence in the target text. Gale and Church calculate the probability of various sentence alignment such as a 1:1 and 1:2 based on a small manually sentence-aligned corpus and then employ dynamic programming to derive the most likely sentence correspondences. As reported in McEnery and Oakes (1996) and Gao (1997), this algorithm is subject to genre and length. Although the accuracy of this method is not high, it can derive initial sentence correspondences, which can be subsequently refined by a dictionary-based approach. This hybrid approach has the merit of limiting the dictionary-based matching to the neighboring sentences proposed by the length-based statistical approach, thus reducing the time and search space of the matching process.

### **Algorithms of Developing a Concept-based Translation Retrieval System**

A bilingual concordancer can accept a query word in the source or target language and present example sentences containing the input word juxtaposed with their translations. As expressions might take the form of a phrase or a sentence, it is more desirable to design a bilingual concordancer which can take a sentence as input. But given the small size of Chinese-English bilingual corpora available, the chance of finding examples identical to the input sentence is slight. To make the tool useful, it should have the capability of extracting and ranking synonymous examples in terms of their relevance to the input query. With this powerful tool, translators and language learners can use the intelligent bilingual concordancer to find the closest match to the input sentence and its translation.

The central question of building such a program is how to compute the similarity

between a sentence and an input sentence. The following procedure is proposed for a concept-based Chinese-English translation retrieval system.

1. Language Identification: A program is written to check if the input is Chinese or English.
2. Tokenization: As there is no delimiter between words in Chinese, a word segmentation program is required to process the Chinese input as well as the Chinese corpus.
3. Lemmatization: Through lemmatization, English words with inflection (whether regular or irregular) will be converted into their lemmas (i.e. basic forms).
4. Indexing: All the words in the Chinese and English texts are indexed so that sentences containing a particular word can be retrieved in no time.
5. Term Weighting: Every Chinese and English word is assigned a weighting based on  $TF * IDF$ . In general, an important term in a document occurs several times. We can thus use the average frequency of a term in all document as an indicator of its importance. Because TF assigns high value to function words, we need IDF to offset the undesirable high value of function words induced by IDF. Inverse Document Frequency (IDF) assumes that the importance of a word is in inverse proportion to the number of documents in which it occurs. In other words, the more documents in which a word occurs, the lower IDF value it has. IDF captures the generalization that words of low indexing value such as function words occur in most documents.
6. Query Expansion Using a Thesaurus: We build a Chinese thesaurus based on an online dictionary of the Ministry of Education (<http://140.111.1.22/mandr/clc/dict/>). The synonyms of the input Chinese words are used for query expansion. The weighting of these expanded query terms are arbitrarily given slightly lower value than that of the original input words on

the ground that synonyms are seldom replaceable in all contexts.

7. Scoring Function: All sentences in the bilingual texts which contain a matched word with the input sentence are retrieved. The similarity of the input sentence and the retrieved sentences is computed based on the sum of the value of  $TF * IDF$  of the matched terms. The sentence with the highest score is considered most similar to the input query.

The algorithm above proposes a simple measure to calculate semantic similarity, which is used in building an intelligent web-based Chinese and English bilingual concordancer. To test its performance, we create a bilingual database by extracting bilingual sentences from a bilingual dictionary. The interface and the output of the program are shown in Figure 2 – 4. As can be seen from Figure 2 and 3, the program works reasonably well and is a valuable and convenient tool to search for appropriate English expressions.

### Limitations of the our Approach

The proposed method relies on paraphrases whose component words can be substituted with synonyms. It cannot handle synonymous relation between 不及格 ‘not pass’ and 被當 ‘flunk’, which are phrasal synonyms that cannot be decomposed using synonyms at word level. Collocations also provide difficulty for our approach. For instance, 低落 ‘down’ is not synonymous with 差 ‘not good’. But combined with 心情 ‘mood’, the collocation 心情低落 is synonymous with 心情差. Our method also falls short in cases where identical component words result in different meaning because of different word order or syntax. Cases like these suggest that a much more sophisticated model is needed.

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Figure 1. Term Weighting and Query Expansion Using a Chinese Thesaurus

term	expansion from	avg. tf	idf	score
保衛	保護	0.5	2.98520185836457	1.49260092918229
庇護	保護	0.3333333333333333	2.80911059930889	0.93637019976963
保護	(null)	0.00925925925925926	1.2528080985416	0.0116000749864963

n	score	source	chinese	english
1	1.49260092918229	942	加拿大雨林 <b>保衛</b> 戰 綻露和平曙光	Peace Breaks Out in War Over Canadian Rainforest
1	1.49260092918229	855	墨西哥以國家軍隊 <b>保衛</b> 森林及水資源	Mexico Opens National Crusade for Forests and Water
1	0.93637019976963	1133	鮭魚餵養森林 森林 <b>庇護</b> 鮭魚	Salmon Feed Forests; Forests Shelter Salmon
1	0.93637019976963	113	地方團體尋求 <b>庇護</b> 歷史古城威尼斯與環境	Local Groups Seek to Shelter Historic Venice & Environs
1	0.93637019976963	1131	庫克群島設立南太平洋的鯨魚 <b>庇護</b> 區	Cook Islands Creates South Pacific Whale Sanctuary
1	0.0116000749864963	620	非洲中部各國聯合 <b>保護</b> 剛果盆地	Central Africa Unites to Protect Congo Basin
1	0.0116000749864963	409	循法律途徑 即刻 <b>保護</b> 北方露脊鯨	Lawsuit Seeks Immediate Protection for Endangered Northern Right
1	0.0116000749864963	158	眾議院中兩黨協議撥出三十億元為 <b>保護</b> 經費	Bipartisan Senate Compromise Pledges \$3 B for Conservation
1	0.0116000749864963	51	重要的歐洲野生動物棲地將從 <b>保護</b> 名單被剔除	Critical European Wildlife Habitats Left Off Protected List
1	0.0116000749864963	1000	永續生產的德基拉酒 對 <b>保護</b> 野生龍舌蘭	Sustainable Tequila: Protecting the Wild



Figure 2.

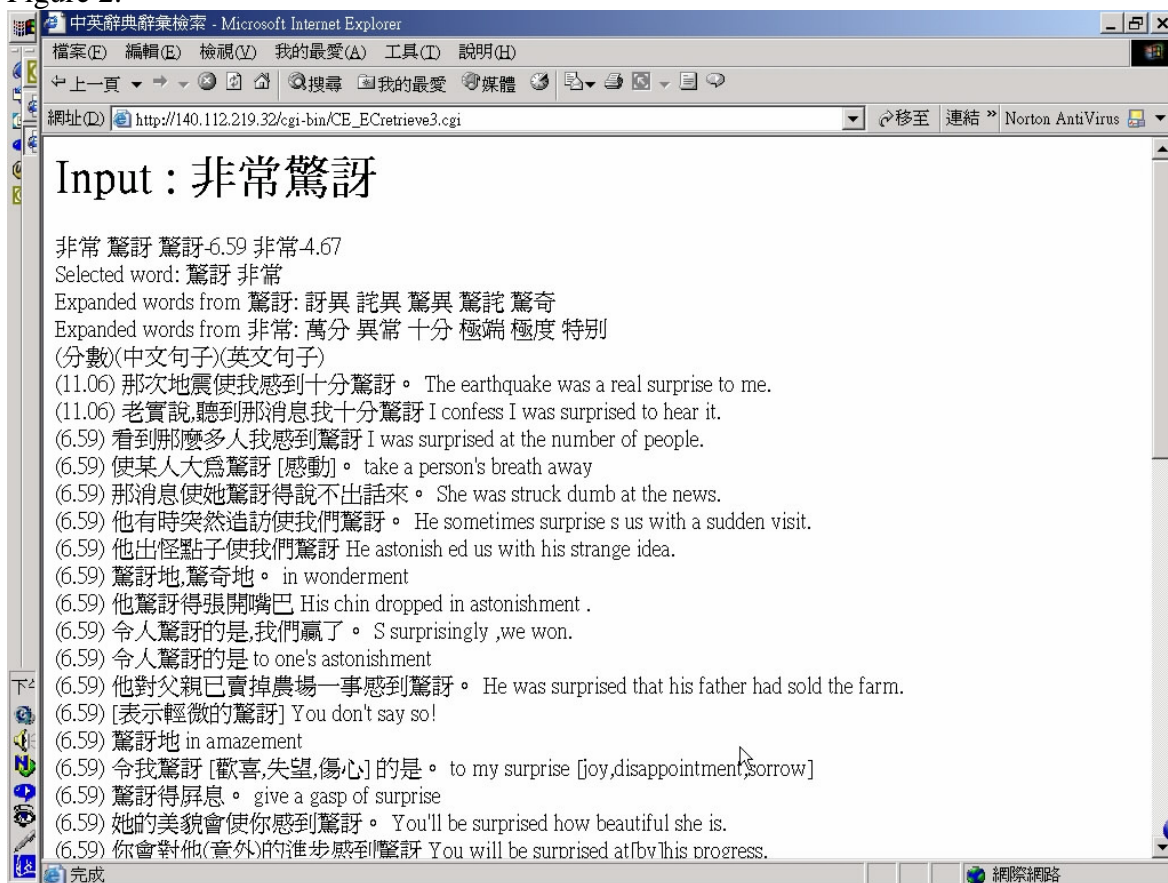


Figure 3

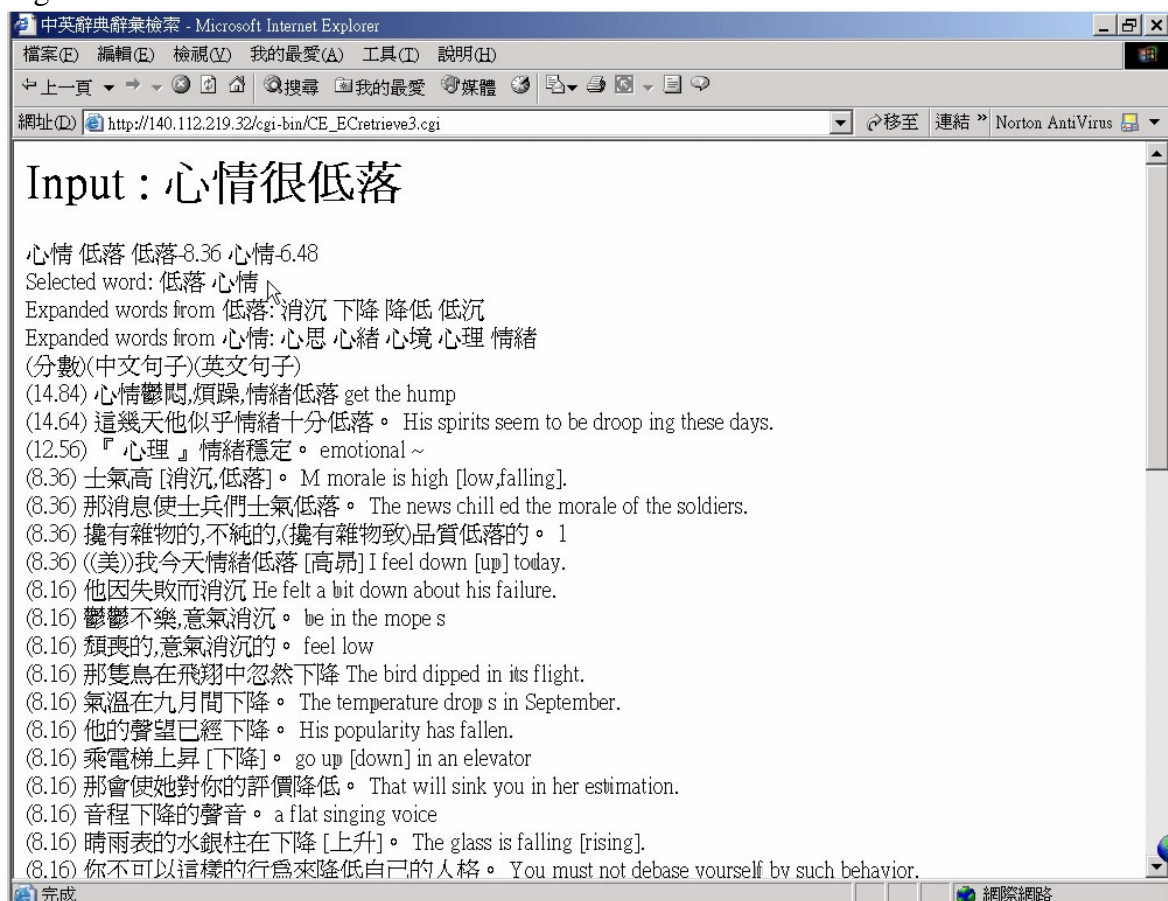


Figure 4.

