

Overview of the TREC 2011 Chemical IR Track

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Abstract

The third year of the Chemical IR evaluation track benefitted from the support of many more people interested in the domain, as shown by the number of co-authors of this overview paper. We continued the two tasks we had before, and introduced a new task focused on chemical image recognition. The objective is to gradually move towards systems really useful to the practitioners, and in chemistry, this involves both text and images. The track had a total of 9 groups participating, submitting a total of 36 runs.

1 Introduction

The Chemical Track of TREC aims to provide professional searchers with an understanding of the limits of the available tools and, at the same time, to stimulate interest from the research community. In organizing this track, we realized that we were in fact addressing two rather distinct research communities, which, although both focus on the chemical domain, do not usually interact. The text mining and image understanding processes are very different, but both of them are essential for the end user, as chemistry heavily relies on non-textual information.

In this campaign, we started in 2009 with a test, to see how current approaches to IR perform when given a corpus of chemical patents and scientific articles [2, 1]. We observed the limits and in the following year we extended the collection to include more scientific articles and, essential, the accompanying images and structure files for many of them. A large collection, of almost 500GB of compressed text and image data was provided, but no specific task was created to require participants to deal with the image data.

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We realized that handling both types is impossible for any research group, and, at the Chemical IR workshop organized last year at TREC, we decided to have a specific task to handle images. This task would require participants to, given an image file, provide the chemical structure of the compound there depicted. It was the most successful tasks this year, with 5 groups sending in their results.

2 Prior Art Task (PA)

2.1 Topics

As in the previous year, the effort this year was to create a balanced selection of topics. Of the total 1000 topics (numbered PA-1001 through PA-2000), 334 were from the European Patent Office, 333 from the US Patents and Trademarks Office and 333 from the World IP Organization. The sources were distributed randomly among the 1000 topics. Consequently, of the small set (PA-1001 through PA-1100) there were 20 from the EPO, 37 from the USPTO and 43 from the WIPO.

2.2 Results

This year we received runs from two participants for the Prior-Art Task. Their results are described in Figure 1.

3 Technology Survey Task (TS)

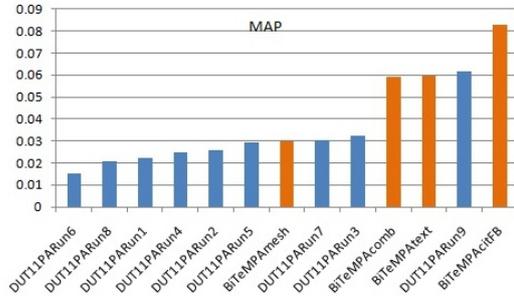
The TS task is a standard ad-hoc retrieval task where the challenge is to retrieve documents from the collection that can best answer the information need expressed in the topic. This year, the TS task focussed on biomedical and pharmaceutical topics, unlike previous years when it dealt with general chemistry topics. The primary motivation was to investigate the ability of state-of-the-art IR systems to deal with the textual diversity in biomedical patents and full-text articles by handling synonyms, abbreviations, naming variants, and many more. The second motivation is the availability of enormous terminological resources in the biomedical domain (such as MeSH¹, UMLS², ATC³, and many more) and the necessity to investigate their adaptability to support information retrieval from patents and full-texts that has not been systematically tested in the past (according to author's knowledge). Although, the TREC Genomics track focussed on retrieval of biomedical full-text articles, there is a need for common platform-based evaluation of IR systems for patents.

In order to deal with this challenge, 6 questions concerning the information needs (also called as *TS-topics*) were provided by domain experts. Altogether, 4 teams sub-

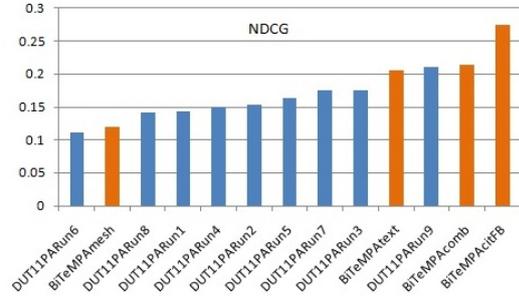
¹Medical Subject Headings, <http://www.nlm.nih.gov/mesh/MBrowser.html>

²Unified Medical Language System, <http://www.nlm.nih.gov/research/umls/>

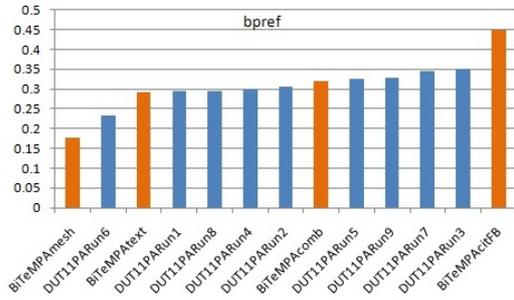
³Anatomical Therapeutic Chemical classification system, http://www.whocc.no/atc_ddd_index/



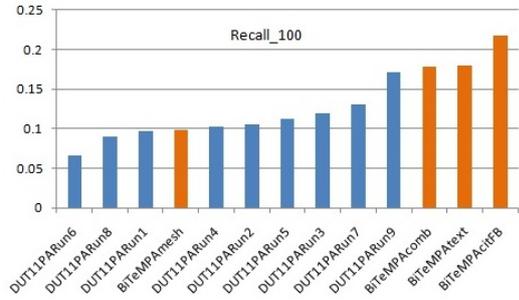
(a) Mean Average Precision



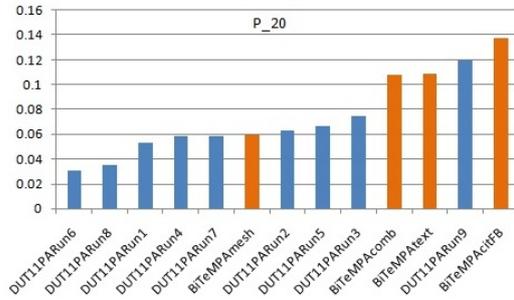
(b) normalized Discounted Cumulative Gain



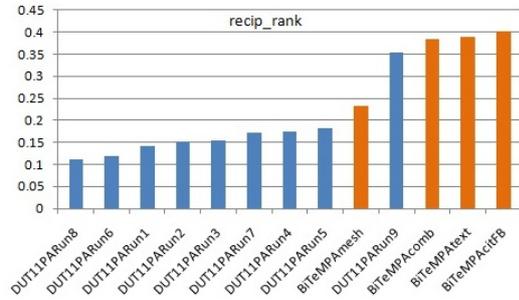
(c) Binary Preference



(d) Recall at 100



(e) Precision at 20



(f) Reciprocal Rank

Figure 1: Results for 6 measures for the Prior-Art task. The two participating groups are identified by different shades in the plots.

The screenshot displays the ChemAssess web interface. On the left, there is a sidebar with document metadata: Title (Tests for HCG hormone), Narrative (The hormone Human Chorionic Gonadotrophin (HCG) is produced when a woman becomes pregnant...), Chemicals (Human Chorionic Gonadotrophin OR HCG), and Condition (Pregnancy). Below this, a 'Show:' filter is set to 'entire pool'. A list of four documents is shown, each with a relevance rating (unjudged, unsure, not relevant, relevant, highly relevant) and a radio button. The first document is selected. The main content area on the right shows the document's details: Examiner information, International convention data, Designated states, and Abstracts. The abstracts section includes 'Abstract EN - Source' and 'Description' with their respective text. A 'Discuss this topic' button is visible in the top right corner.

Figure 2: Illustration of the user interface of the ChemAssess tool.

mited 14 runs for this year's task. Information about the topics can be found in the Appendix. Details of the evaluation and results can be found in the following subsections.

3.1 Sampling and Relevance Judgement

We employed the stratified sampling approach for generating a pool of documents for evaluation of each topic following the [3] method. We took all results returned in the top 10 by any run, 30% of those in the top 30 and 10% of the rest (down to rank 1000).

As last year, the TS topic evaluation was performed in parallel by junior and senior evaluators. A parallel evaluation is believed to enhance the level of interaction between the evaluators as well as reduce the overall time required for the evaluation process. Senior evaluators designate the patent experts who formulated the TS topics whereas the junior evaluators were graduate students who hold an academic major degree in biotechnology, bioinformatics, or medicine. One junior evaluator and one senior evaluator made judgments for each topic. Therefore, the judges team was composed of 6 junior and 4 senior evaluators each handling strictly one topic. The tool used for the evaluation was ChemAssess⁴. For a given pooled document set for each topic, a junior evaluator makes a judgement as the document is *unjudged*, *unsure*, *not relevant*, *relevant*, or *highly relevant*. The ChemAssess tool does not allow overlapping annotations and therefore each document ends up having only one judgement. Table 1 shows the number of documents contained in pooled document sets for each TS topic. An illustration of the user interface of the ChemAssess tool is shown in Figure 2.

⁴<http://chemassess.ifs.tuwien.ac.at/>

Table 1: Size of the pooled document sets for each TS topic.

Topic	No. of documents
TS-20	411
TS-22	558
TS-28	736
TS-29	474
TS-33	612
TS-37	507
Total	3298

Table 2: Counts of comments or discussion passes over different topics by evaluators and track organizers.

Topic	Junior Evaluator	Senior Evaluator	Organizer
TS-20	3	2	0
TS-22	7	4	0
TS-28	6	7	1
TS-29	1	1	0
TS-33	5	5	0
TS-37	0	0	0

For every document in the pool, the junior evaluator first decides the relevancy of a document based on his/her personal knowledge. Junior evaluators were facilitated with a set of biomedical terminological resources and databases in order to understand the synonyms and naming conventions of biomedical entities. For example, the junior evaluators referred to Swissprot for protein names, DrugBank for drug names, MeSH and UMLS for medical terms (such as diseases), and KEGG BRITE⁵ for various biological entities such as pharmacological terms, pathways, and many more. In case of uncertainty in the decision, junior evaluators had an option to interact with the senior evaluators or track organizers within the ChemAssess environment. Based on the overall comments, the junior evaluators made the final judgement over a document's relevancy to the respective topic. Table 2 shows the number of comments or discussions passed over different TS topics by the evaluators. Table 3 shows the final results of judgement for every TS topic

3.2 Performance Measures

Performances of the submitted runs were evaluated using the evaluator's judgements as a golden standard. As evaluation metrics, inferred average precision (xinfAP) and the inferred normalized discounted cumulative gain (infNDCG) were applied.

⁵<http://www.genome.jp/kegg/brite.html>

Table 3: Results of final judgements by evaluators for all TS topics. Number of documents (#doc) and percentage of documents (%doc) are provided.

Topic	#doc	Highly Relevant		Relevant		Not Relevant		Unsure		Unjudged	
		#doc	%doc	#doc	%doc	#doc	%doc	#doc	%doc	#doc	%doc
TS-20	411	32	7.79%	31	7.54%	348	84.67%	0	0.00%	0	0.00%
TS-22	558	1	0.18%	9	1.61%	548	98.21%	0	0.00%	0	0.00%
TS-28	736	11	1.49%	3	0.41%	722	98.10%	0	0.00%	0	0.00%
TS-29	474	2	0.42%	72	15.25%	397	84.11%	1	0.21%	0	0.00%
TS-33	612	51	8.33%	55	8.99%	506	82.68%	0	0.00%	0	0.00%
TS-37	507	11	2.17%	18	3.55%	478	94.28%	0	0.00%	0	0.00%

3.2.1 xinfAP

In [3], Yilmaz and colleagues extended the infAP measure by taking non-random samples from the pool of documents. We adopted this measure because it appears to estimate AP more accurately than infAP, given the same evaluation effort.

3.2.2 infNDCG

Also based on a stratified sampling approach, infNDCG extends nDCG, whose aim is to represent the common view that relevant documents returned higher in the ranked list are more important than similarly relevant documents returned lower in the list.

3.3 Results of Technology Survey Task

This year we received runs from 4 participants (for a total of 14 runs). Figure 3 describes the results of the evaluation. The figure shows a cumulative plot for each run, where each task is stacked on top of the others. This way, it is easier to observe how each run performed for each topic.

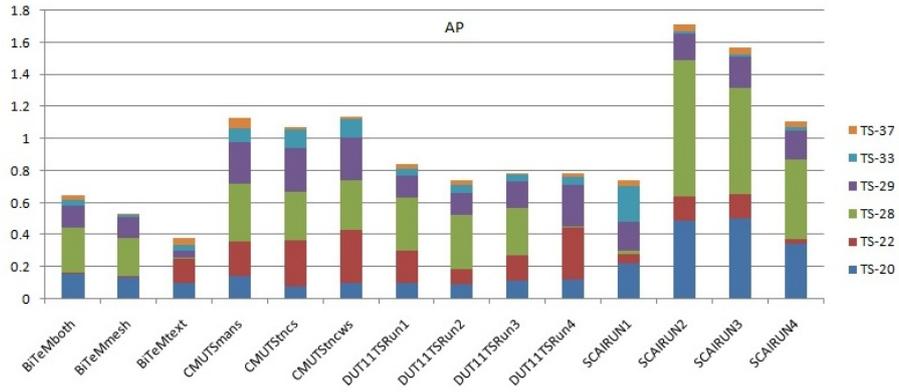
4 Image-to-Structure Task (I2S)

The main purposes of this task include evaluation of the state of the art in the chemical image recognition field and the applicability of image recognition for information retrieval goals.

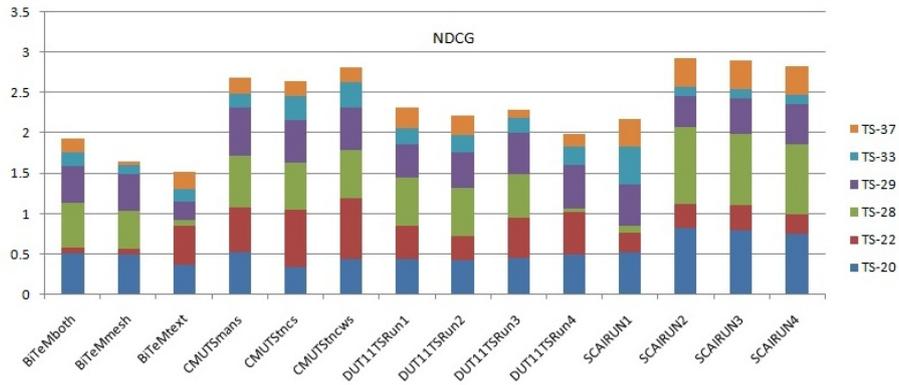
4.1 Topics

Two sets each containing 1000 images and the corresponding MOL⁶ files have been selected to act as a training and an evaluation sets from the USPTO file collection. The following criteria were used in the selection process:

⁶http://en.wikipedia.org/wiki/Chemical_table_file



(a) Mean Average Precision



(b) normalized Discounted Cumulative Gain

Figure 3: A stack-like plot of the results of each participant in the TS task, for two measures: extended inferred AP and inferred nDCG

- No polymers (brackets in the molecule description), charges or isotopes - judged by the presence of text lines starting with "M" but not "M END" in the ctab block of the MOL file.
- No multi-fragment MOL files, only one molecule per file is allowed.
- Allow only "organic" elements - C, N, O, S, F, Cl, Br, I, P, and H.
- Check that ctab records for all atoms correspond to the formal charge of 0 and that the isotope type is unspecified (default).
- Check that there are no stereobonds with stereo orientation specifically set to "undefined"
- Check that the number of heavy (non-Hydrogen) atoms is greater than 6, and the molecular weight is lower than 1000 a.u.
- Check that InChI⁷ can be created for the selected molecules.

These criteria allowed the organizers to focus on small organic molecules for which a reasonably widely accepted and well-defined chemoinformatic identity measure exists - namely InChI and InChI key. Those are also the types of molecules believed to be of the most interest to the chemical and pharmaceutical industry. Training set of images and MOL files and the evaluation set of images only have been made available to the participants.

4.2 Evaluation

Participants of the Image2Structure task have been asked to submit the results of their runs in the form of SD files. SD file format is analogous to MOL with the exception that it allows for multiple molecules to be stored in a single file. This difference between the ground truth MOL format and the requested SD format was deliberate to allow for the possibility that recognition software may erroneously generate several output molecules for a single molecule input image. There are many free and commercial software utilities which allow interconversion between alternative formats, such as SMILES⁸, and SDF. The runs were evaluated based on a recall measure by matching of the standard InChI keys computed from the original MOL file and the SD file representing recognition software output. Chemical identity is often a subject of ongoing debates among chemists about what constitutes a unique molecule. InChI - IUPAC International Chemical Identifier - is a text representation of a molecule which was designed to compute normalized, canonical text string from the original molecule representation. InChI takes into account certain forms of tautomerism, stereochemistry, etc. InChI key is a hashed version of InChI. Standard InChIs and InChI keys, while not completely free of their share of issues, are widely used as unique chemical identifiers by chemists worldwide. Therefore

⁷<http://en.wikipedia.org/wiki/InChI>

⁸<http://en.wikipedia.org/wiki/Smiles>

Table 4: Participants in the Image-to-Structure tasks

Participating group	Run name(s) identifier
University of Birmingham	UoB
SAIC-Frederik / NIH	OSRA
GGA Software	GGA
University of Michigan	ChemReader
Fraunhofer SCAI	ChemOCR

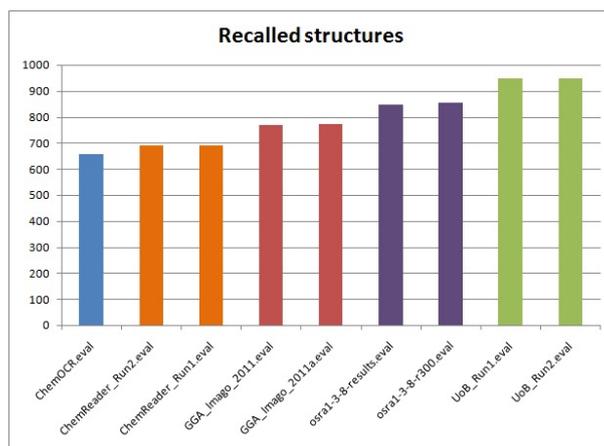


Figure 4: The objective of the Image-to-Structure task was to recognize structures. The plot shows how many correct structures each run identified.

standard InChI keys have been selected for Image2Structure evaluation as a relatively controversy-free chemical identity measure.

4.3 Results

This year, the Image-to-Structure task received 11 runs from 5 participants. Overall, results were very good, with all participants recognizing over 60% of the given structure images. Figure 4 shows the results for each run. Table 4 connects the names of the runs in Figure 4 with the participating groups.

5 Conclusion

This year it was clear that the Prior Art task had reached its final point. From it, we learned the extent to which we can, in one hit, get relevant documents to a patent application in the chemical domain. We were delighted to see engagement between students and senior evaluators in the Technology Survey task, and, in the following months, look to participants to provide a deep analysis of what worked and what did not work for the bio-chemical domains. We were also happy with the participation in

the Image-to-Structure task. After all, there are only a handful of groups who do this professionally, and of all those contacted, only two could not send in results.

Acknowledgements

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References

- [1] M. Lupu, J. Huang, J. Zhu, and J. Tait. TREC Chemical Information Retrieval - An Evaluation Effort for Chemical IR Systems. *WPI Journal*, 2011.
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- [3] E. Yilmaz, E. Kanoulas, and J. A. Aslam. A simple and efficient sampling method for estimating AP and NDCG. In *SIGIR '08: Proceedings of the 31st annual international ACM SIGIR conference on Research and development in information retrieval*, pages 603–610, New York, NY, USA, 2008. ACM.

6 Appendix

Topics used in the Technology Survey Task of TREC-CHEM 2011.

Topic	Title	Narrative
TS-20	Tests for HCG hormone	The hormone Human Chorionic Gonadotrophin (HCG) is produced when a women becomes pregnant. Tests are usually carried out by analysing blood or urine. We are looking for articles and patents on these pregnancy test kits or the chemical tests used to produce them.
TS-22	Uses of hormones in detection of menopause	The onset of menopause in women is complex and often difficult to detect accurately. We are looking for methods, devices, or kits using the fertility hormones Luteinizing hormone (LH), Follicle stimulating hormone (FSH) for detection of the menopause in women.
TS-28	D-ala-D-ala ligase inhibitors	D-ala-D-ala ligase is a well known antibacterial target and the idea is to find potent inhibitors of this bacterial enzyme which have the ability to kill bacteria. Getting the additional MICs data (usually as tables in the body of a patent) is very important.
TS-29	Inhibitors for acetylcholinesterase	Acetylcholinesterase inhibitors is a potential target for Alzheimer's disease so identifying potent inhibitors of this human enzyme may lead to new treatments of this devastating disease
TS-33	Respiratory tract disorders treatment using inhalation of porous particles containing hydrophobic amino acid and endogenous phospholipids	Find patents that claim use of porous inhalation particles that contain a hydrophobic amino acid (e.g. leucine, isoleucine, phenylalanine, etc.) and endogenous phospholipid(s) (e.g. phosphatidylcholines, phosphatidylethanolamines, etc.) for treatment of respiratory tract disorders.
TS-37	DNA-based asymmetric catalysis	The users are looking for information about DNA-based asymmetric catalysis, especially sample reactions that have been done so far. The novel concept of DNA-based asymmetric catalysis was introduced only five years ago, thus there would not be too many results, most of which are enantioselective Diels-Alder reactions.