



**HAL**  
open science

## Combining NER Systems via a UIMA-based platform

Baptiste Gaillard, Sylvie Guillemin-Lanne, Guillaume Jacquet, Claude Martineau, Aurélie Migeotte

► **To cite this version:**

Baptiste Gaillard, Sylvie Guillemin-Lanne, Guillaume Jacquet, Claude Martineau, Aurélie Migeotte. Combining NER Systems via a UIMA-based platform. 1st French-speaking meeting around the framework Apache UIMA, Jul 2009, Nantes, France. pp.4. hal-00637261

**HAL Id: hal-00637261**

**<https://hal.science/hal-00637261v1>**

Submitted on 31 Oct 2011

**HAL** is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

# Combining NER Systems via a UIMA-based platform

**Baptiste Gaillard**

Thales Communication

1-5 Avenue Carnot, 91883 Massy

Baptiste.gaillard@fr.thalesgroup.com sylvie.guillemine-lanne@temis.com

**Sylvie Guillemine-Lanne**

Temis –Tour Gamma B

193-197 rue de Bercy, 75582 Paris

**Guillaume Jacquet**

XRCE – 6 chemin de Maupertuis,  
38240 Meylan

Guillaume.Jacquet@xrce.xerox.com

**Claude Martineau**

IGM-LabInfo Université Paris-Est  
77454 Marne-la-Vallée Cedex 2

stavroula.voyatzi@univ-mlv.fr

**Aurélie Migeotte**

Arisem – 1-5 rue Carnot  
91883 Massy cedex

Aurelie.Migeotte@arisem.com

## Abstract

In this paper, we present a tool aiming at merging named entity annotations provided by different named entity recognition systems. This tool is based on UIMA platform and contains a merging module which uses information about the compatibility of various annotations and can point out conflicts, and thus yields annotations that are more reliable than those of any single annotator. This work has been performed as part of the Infom@gic project

## 1 Introduction

In this paper, we present a tool aiming at merging named entity annotations provided by different Named Entity Recognition systems (henceforth NER systems). It takes as input a set of text (simple text, xml or html) and gives as output a set of annotated text in a UIMA format. It contains an algorithm for merging the different annotations which uses information about the compatibility of various annotations and can point out conflicts, and thus yields annotations that are more reliable than those of any single annotator. This work has been performed as part of the Infom@gic project, whose goal is the integration and validation of knowledge engineering and information analysis applications, and which is supported by the pole of competitiveness Cap Digital “Image, MultiMédia et Vie Numérique”. We first describe UIMA, which provides archi-

ture to coordinate information from different modules. Then, we present the needed input of our software. Then, we present an algorithm for merging the different annotations. We conclude by describing the software output and a preliminary evaluation of the results we obtained.

## 2 Connected works

In many scientific domains, it is well known that combining different methods or systems allows a result improvement comparing to results obtained by each system. For instance, the *Adaboost* Algorithm (Schwenk, 1999) consists in training a set of similar systems as a workflow where each system is trained to correct errors from the previous system.

In the NER domain, (Borthwick *et al.* 1998) and (Kozareva *et al.*, 2007) merged some NER system using majority vote method. In each case, the merged system obtains better precision results than any system alone.

Our tool aims at helping NER community to improve their results by merging existing systems. Our specificity is to propose a common platform where we can aggregate any NER system and where the merging module is already integrated. Moreover, inside the Infom@gic project, we developed this tool as an input for search engine or information extraction systems. Consequently, our tool deals with xml and html input format. Comparing to (Borthwick *et al.* 1998) and (Kozareva *et al.*, 2007), our last algorithm specificity is to deal with annotation overlapping cases.

### 3 The UIMA platform

UIMA (*Unstructured Information Management Architecture*) is an architecture for managing, organizing and coordinating unstructured information (Ferrucci and Lally, 2004). It originated at IBM and is now an open source project at the Apache Foundation (<http://incubator.apache.org/uima/>). This architecture has been developed specifically for the management of NLP tools: Ferrucci and Lally propose an example of rapid integration of a syntactic parser and a NER system. Its goal is to increase scientific progress with a fast combination of unstructured information management technologies. In our tool, we used UIMA as a common platform for all the used NER systems and for developing our merging module.

### 4 Software input and output

Our software takes as input a set of text (simple text, xml or html), integrate them in the workflow of a set of existing NER systems, merge their output and finally yield a UIMA CAS object (Common Analysis System object readable as an xml file) containing a unique set of annotations without redundancy, resolving some named entity boundary or identification conflicts.

Each NER system can be implemented directly using the UIMA libraries or using another language and then encapsulate it in the UIMA platform (this is the usual case). In this case, the only added work for an existing NER system is to establish a correspondence table between its own annotations and the UIMA platform annotations. Figure 1 describes the UIMA interface to construct the NER systems workflow, to define the used merging module and to choose the input and output format.

### 5 Algorithm for merging annotations

This merging process combines annotations from different NER systems in order to obtain a system that benefits from the unique characteristics of each annotator. This merging process is not trivial: First of all, all annotators must agree on a common type hierarchy of annotations. Secondly, the merging process must deal with redundant annotations. It corresponds to six different cases which are covered by our algorithm. Thirdly, it must deal with conflicting annotations.

The algorithm has been developed by the four partners of Experiment 1:

1. NEs with same offsets (A = B) :
  - a. Same annotation → Merge
  - b. NEs with different annotations where one annotation is descendant of the other → keep the most specific annotation
  - c. NEs with different annotations that have a common parent type → use the parent annotation
  - d. NEs with different annotations (other cases) → majority vote.
2. One NE included in another (A= Barack, B= Barack Obama or A= Obama, B= Barack Obama or A= Hussein, B=Barack Hussein Obama)
  - a. Same annotation → keep the longer one.
  - b. NEs with different annotations which have a common parent type or where one annotation type is a descendant of the other → keep the longer one with its type
  - c. NEs with different annotations (other cases) → keep both NEs.
3. One NE overlaps another (AB= Barack Hussein, BC= Hussein Obama)
  - a. Same annotation → merge ABC.
  - b. NEs with different annotations which have a common parent type or where one annotation type is a descendant of the other → merge ABC with the coarsest annotation.
  - c. NEs with different annotations (other cases) → keep both NEs.

### 6 Experiments and results

Our tool has been tested on two experiments.

**Experiment 1** (Brun *et al*, 2009): software input is a set of web sites and the merged NER systems are four NER systems based on symbolic approaches implemented by four different partners (Arisem, IGM, Temis and Xerox). After an agreement on a common hierarchy of annotation types, each partner encapsulated its own NER system in a common platform. This experiment is done on French texts. Table below present a summary of the obtained results:

	P	R	F2
Annot. 1	67.53	60.85	64.02
Annot. 2	61.85	44.36	51.67
Annot. 3	73.24	49.38	58.99
Annot. 4	75.23	66.35	70.51
<b>Fusion</b>	<b>80.10</b>	<b>65.11</b>	<b>71.83</b>

**Experiment 2** (Ah-Pine and Jacquet, 2008): The input is a hybrid case combining a new statistical approach implemented in the UIMA formalism with different existing systems: Stanford, Gate and Xerox NER systems. This experiment is done on English texts. Table below present a summary of the obtained results:

	P	R	F2
Xerox system	77.77	56.55	65.48
Stanford system	67.94	68.01	67.97
CBC system	70.66	32.86	44.86
<b>Fusion</b>	<b>73.55</b>	<b>78.93</b>	<b>76.15</b>

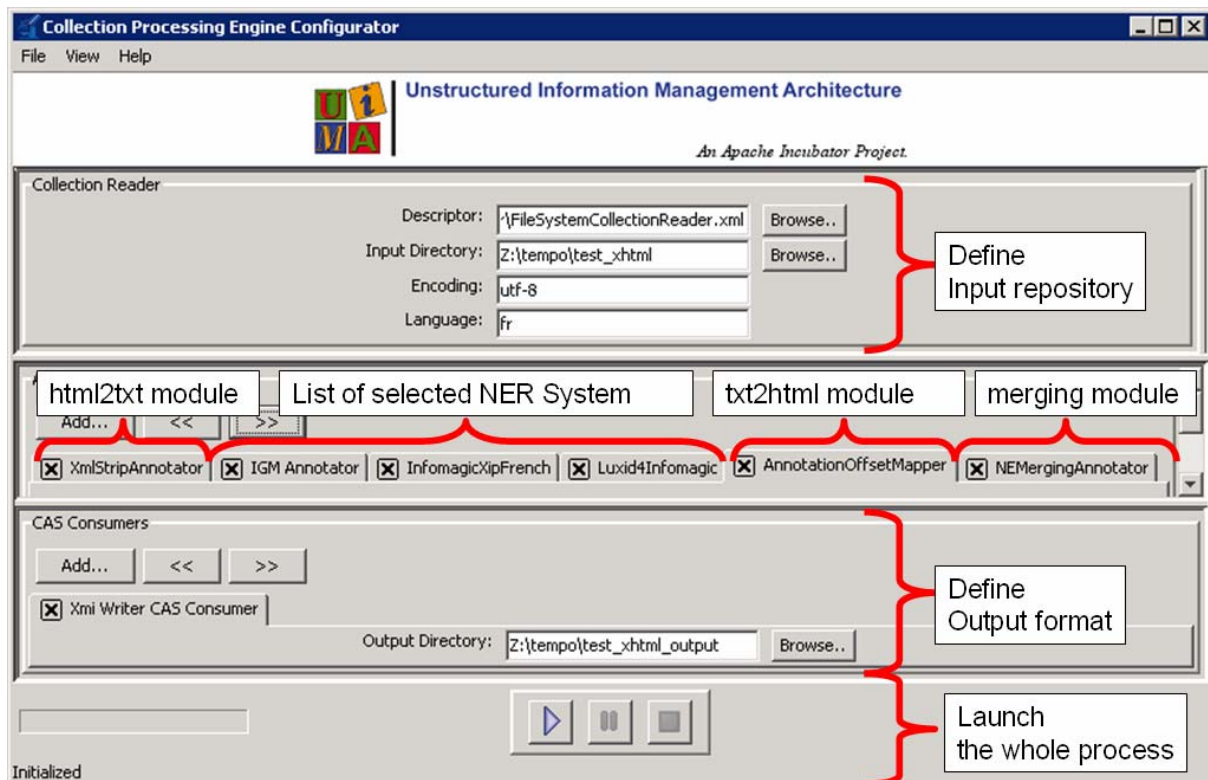
We refer to the corresponding papers for more details on these experiments. These results must be seen as an evidence that our software has been implemented, that it works with different set of NER systems and with different input types: html texts for experiment 1 and classic texts for experiment 2 (cf. figures 2 and 3 for some illustrations of these texts). Finally, these experiments show that the merged system improve the results of each initial NER system. This improvement is a last evidence of the usefulness of such tool for the NLP community.

### Demo technical requirements

This demo doesn't need any specific technical requirement except an internet access.

### References

- Ah-Pine J. and Jacquet G.. 2009. *Clique-Based Clustering for improving NER Systems*, in proceedings of EACL2009, Athens.
- Borthwick. A., Sterling J., Agichtein E. et Grishman R. (1998). Exploiting diverse knowledge sources via maximum entropy in named entity recognition, In *Proceedings of the Sixth Workshop on Very Large Corpora, Montreal*, pp. 152-160.
- Brun C., Dessaigne N., Ehrmann M., Gaillard B., Guillemin-Lanne S., Jacquet G., Kaplan A., Kucharski M., Martineau C., Migeotte A., Nakamura T., Voyatzi S. submitted. *Une expérience de Fusion pour l'annotation d'entités nommées*, in proceedings of TALN2009, Senlis.
- Ferrucci D. and Lally A. 2004. UIMA: an architectural approach to unstructured information processing in the corporate research environment. *Natural Language Engineering*, 327-348.
- Kozareva Z., Ferrández O., Montoyo A., Muñoz R. et Suárez A. (2007). Combining Data-Driven Systems for Improving Named Entity Systems, *Data & Knowledge Engineering*, 61:3, Elsevier Science Publishers B.V., Amsterdam, The Netherlands,.
- Schwenk H. 1999. Using boosting to improve a hybrid Hmm/Neural Network speech recognizer, In *Proceedings of the International Conference on Acoustics, Speech and Signal Processing*, Phoenix, AZ, USA, pp. 1009-1012.



UIMA Interface for workflow construction and launching



Annotation Results for doc0 in /home/gjacquet/projets/EMNLP2008/Web\_news/folder\_corpus\_abstract\_eval\_clean\_part1/out/

WASHINGTON (AP) -- Democrat Barack Obama has a message for Tennessee's Republican Party: "Lay off my wife." Obama, his party's presidential front-runner, and his wife, Michelle, were asked in an interview aired Monday on ABC's "Good Morning America" about an online video last week by the state's GOP taking her to task for a comment some considered unpatriotic.

"The GOP, should I be the nominee, can say whatever they want to say about me, my track record," Obama said. "If they think that they're going to try to make Michelle an issue in this campaign, they should be careful because that I find unacceptable, the notion that you start attacking my wife or my family." He called the strategy "low class."

The video, posted on YouTube, centered on remarks Michelle Obama made while campaigning in Wisconsin last February, when she said: "For the first time in my adult life, I am really proud of my country."

The four-minute video replayed the remark six times, interspersing it with commentary by Tennesseans on why they are proud of America. In a news release that included a link to the video, Tennessee's GOP said "the Tennessee Republican Party has always been proud of America." It urged radio stations to play "patriotic music" during Michelle Obama's visit to Nashville last Thursday.

Michelle Obama later clarified the remark, saying she meant she was proud of how Americans were engaging in the political process and that she had always been proud of her country.

"Whoever is in charge of the Tennessee GOP needs to think long and hard

Legend

<input type="checkbox"/> Document...	<input checked="" type="checkbox"/> City	<input checked="" type="checkbox"/> Company	<input checked="" type="checkbox"/> Conflict	<input checked="" type="checkbox"/> Country
<input checked="" type="checkbox"/> Date	<input checked="" type="checkbox"/> Location	<input checked="" type="checkbox"/> MediaOrga...	<input type="checkbox"/> Merging	<input type="checkbox"/> OffsetBlock
<input checked="" type="checkbox"/> Organisati...	<input checked="" type="checkbox"/> Overlap	<input checked="" type="checkbox"/> Person	<input checked="" type="checkbox"/> Population	<input type="checkbox"/> TextBlock

Select All Deselect All Hide Unselected Sofa: txt

Annotations

- Overlap ("Tennessee Republican Party")
  - begin = 1131
  - end = 1157
  - neList = FSArray
    - neList = Location ("Tennessee")
      - begin = 1131
      - end = 1140
      - source = Stanford
    - neList = Organisation ("Tennessee Republican Party")
      - begin = 1131
      - end = 1157
      - source = xipEnglish;Gate

Output visualization from Experiment 2 on an English text. We focus on how our system describes an overlap case (« Tennessee Republican Party » as *Organisation* and « Tennessee » as *Location*)

Annotation Results for index\_output.xcas in /home/gjacquet/projets/infomagic/merging\_NE/29\_10\_08/output\_r

reprndrait et que ça confinait à l&#39;escroquerie ... et avec le recul je ne suis pas sûr que ce fût une si mauvaise chose, parce que ça a probablement contribué à ce que par la suite j&#39;écoute un peu plus de sons différents ... même si je ne les apprécie pas forcément, au moins je fais l&#39;effort d&#39;écouter avant de juger.</p>

<p>Pour l&#39;oeuvre que je préfère, j&#39;hésite entre la <em>Music for Royal Fireworks</em> de Haendel qui a occupée beaucoup de mon temps pendant mes années lycée et <em>Toccata et Fugue en Ré mineur</em> de JS Bach qui a été (interprétée aux grandes orgues) ma &quot;musique de chevet&quot; pendant une grande partie de mes années collège.</p>

<p><strong>Melpomène demande :</strong> <em>Sur le simple chant, à quoi vont tes préférences&#160;? Chantes tu&#160;? Et pour ce qui est de la tragédie ?</em></p>

<p>Les chœurs dans le <em>Dies Irae</em> du <em>Requiem</em> de Mozart. Premier exemple qui me vient à l&#39;esprit. Suivi de très très près par le chant d&#39;opérette, en particulier <em>La Vie Parisienne</em> d&#39;Offenbach; grand moment de joie !<br />L&#39;opéra n&#39;est pas loin non plus, <em>La Flûte Enchantée</em> de Mozart par exemple ...</p>

<p>Je chante. Faux. Très faux. Au point que ma prof de musique m&#39;avait interdit strictement de chanter durant les cours ... Donc disons plutôt que je me rêve sachant chanter ...</p>

<li><em>Serge Gainsbourg</em> reste pour moi un des meilleurs auteurs-compositeurs-interprètes français. Il a su s&#39;adapter

Legend

<input checked="" type="checkbox"/> City	<input checked="" type="checkbox"/> Company	<input checked="" type="checkbox"/> Conflict	<input checked="" type="checkbox"/> ContactInfor...	<input checked="" type="checkbox"/> Country
<input checked="" type="checkbox"/> CulturalEvent	<input checked="" type="checkbox"/> Date	<input checked="" type="checkbox"/> DateAndTime	<input type="checkbox"/> DocumentA...	<input checked="" type="checkbox"/> Length
<input checked="" type="checkbox"/> Location	<input checked="" type="checkbox"/> Merging	<input type="checkbox"/> NamedEntity	<input checked="" type="checkbox"/> NumericalEx...	<input checked="" type="checkbox"/> Organisation
<input checked="" type="checkbox"/> Overlap	<input checked="" type="checkbox"/> Person	<input checked="" type="checkbox"/> Region	<input type="checkbox"/> SourceDoc...	<input checked="" type="checkbox"/> TelFax
<input type="checkbox"/> TextBlock	<input checked="" type="checkbox"/> Time	<input checked="" type="checkbox"/> Work		

Annotations

- Merging ("Offenbach")
  - begin = 43483
  - end = 43492
  - neList = FSArray
    - neList = Person ("Offenbach")
      - begin = 43483
      - end = 43492
      - source = Arisem
    - neList = Person ("Offenbach")
      - begin = 43483
      - end = 43492
      - source = Xerox
  - Conflict ("Offenbach")
    - begin = 43483
    - end = 43492
    - neList = FSArray
      - neList = Region ("Offenbach")
        - begin = 43483
        - end = 43492
        - source = Temis;Arisem
      - neList = Person ("Offenbach")
        - begin = 43483
        - end = 43492
        - source = Xerox;Arisem

Output visualization from Experiment 1 on a French html file. We focus on how our system describes a conflict case (« Offenbach » as a *Region* and « Offenbach » as a *Person*)