# The ENCOPLOT Similarity Measure for Automatic Detection of Plagiarism

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I'll be short...

# Thank you!

.

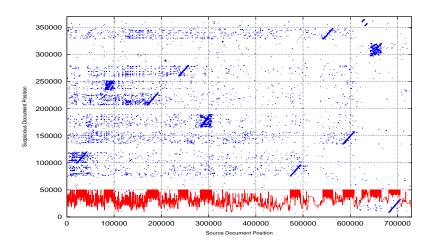
Our extended paper http://brainsignals.de/encsimTR.pdf

### Results

External plagiarism, same language.

- ▶ 2009: 1<sup>st</sup>
- ▶ 2010: 4<sup>th</sup> (2<sup>nd</sup> w. vers.2011)
- ▶ 2011: 2<sup>nd</sup> (1<sup>st</sup>?)
  - best score on the manual paraphrasing
  - best recall on the non-translated corpus

### Encoplot and the Similarity Measure



### **Encoplot Features**

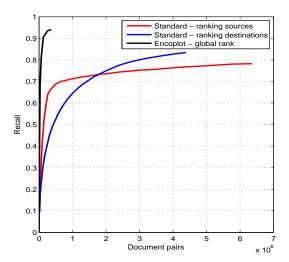
- Guaranteed linear time Dotplot is quadratic.
- ► Extremely fast highly optimized open-source implementation, for N-grams up to N=16, on 64 bit CPUs.

Grozea et. al. (PAN 2009)

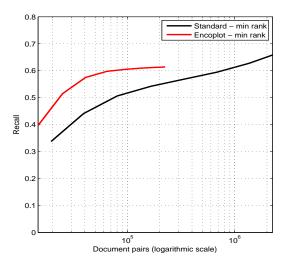
### The Parallel Encoplot

- Open source, licensed under Apache APL http://code.google.com/p/parallelencoplot/
- Includes the parallelization with BSC SMPSs
- Scalable, tested on a machine with 256 cores
   HPC Europa2 - You can have that too!

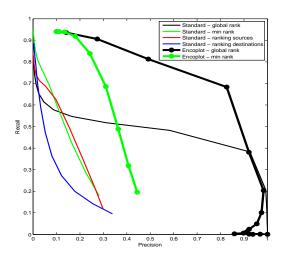
# Ranking - 2010



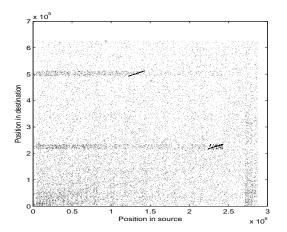
# Ranking - 2011



### Ranking - 2010 P-R



### Who's the Thief?



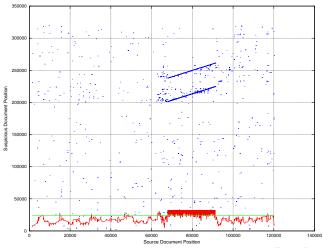
Grozea and Popescu (CICLING 2010) - 75%

Found anything useful to you?

Thank you again!

# Reserve slides

# 2010 duplicates



# 2011 Corpus

Table: Results on 2011 Competition Data

Subset	Size	Recall	Precision	F-score	Granularity	Plagdet
						score
Entire corpus	49,621	0.34	0.81	0.48	1.22	0.42
No paraphrasing	976	0.90	0.84	0.86	1.02	0.85
Manual paraphras-	4,609	0.36	0.96	0.53	1.06	0.50
ing						
Automatic low	19,779	0.58	0.90	0.71	1.27	0.60
Automatic high	19,115	0.08	0.64	0.14	1.19	0.13
Manual translation	433	0.08	0.25	0.12	1.01	0.12
Automatic transla-	4,709	0.23	0.40	0.29	1.07	0.28
tion						

#### Other Bits

2011 no obfuscation: 976 = 1.97% of 49 621 total (vs. 40%).

The 18% includes about 10 000 from the intrinsic corpus.

2010 multiplicity problem:

Maximum multiplicity =17 (source 8584, suspicious 3283).

55 723 external plagiarism instances

10 694 of which with multiplicity  $\geq 2$  (20% of total).

3 483 with multiplicity at least 3.

Being able to handle multiplicity up to 4 would leave out only 506 instances.

2010 performance: plagdet score 0.72 (first team - 0.78), with recall 0.66 and precision 0.86, without handling the translated cases (14%).



#### N-Gram Coincidence Plot

### Algorithm

Input: Sequences A and B to compare

Output: list (x,y) of positions in A, respectively B, where there is

exactly the same N-gram

#### Steps

- 1. Extract the N-grams from A and B
- 2. Sort these two lists of N-grams
- 3. Compare these lists in a modified mergesort algorithm.

Whenever the two smallest N-grams are the equal, output the position in A and the one in B.

## Small example

A=abcabd B=xabdy

N=2	Encoplot pairs	Dotplot pairs			
	1 2 ab	1 2 ab			
		4 2 ab			
	5 4 bd	5 4 bd			
VI—3	Encoplot pairs	Dotplot pairs			

4 2 abd

4 2 abd

#### Fast Radix Sort for N-Grams

```
for(i,NN)ix[i]=i;
//radix sort, the input is x,
// the output rank is ix
for (k, RANGE) counters [k] =0;
for(i.NN)counters[*(x+i)]++:
for(j,DEPTH){
   int ofs=j;//low endian
   t_int sp=0;
   for(k,RANGE){
      startpos[k]=sp;
      sp+=counters[k];
   for(i,NN){
      unsigned char c=x[ofs+ix[i]];
      ox[startpos[c]++]=ix[i];
   memcpy(ix,ox,NN*sizeof(ix[0]));
   //update counters
   if(j<DEPTH-1){
      counters[*pout++]--;
      counters[*pin++]++;
```

- ▶ Who's the Thief? Automatic Detection of the Direction of Plagiarism, C.Grozea and M.Popescu, CICLING 2010, LNCS 6008, DOI 10.1007/978-3-642-12116-6, 2010
- ► ENCOPLOT: Pairwise Sequence Matching in Linear Time Applied to Plagiarism Detection, C.Grozea, C.Gehl, and M.Popescu In Proceedings of the 3rd PAN Workshop. Uncovering Plagiarism, Authorship and Social Software Misuse, San Sebastian, Spain, 2009. Universidad Politecnica de Valencia 2009
- Encoplot Performance in the Second International Plagiarism Detection Challenge, C. Grozea and M. Popescu, Lab Report for PAN at CLEF 2010
- Plagiarism Detection with State of the Art Compression Programs, C.Grozea Report CDMTCS-247, Centre for Discrete Mathematics and Theoretical Computer Science, University of Auckland, Auckland, New Zealand, 2004.



# Self-plagiarism

