

# Génération et détection automatique de faux articles scientifiques

Ateliers de l'information

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12 Janvier 2015



## 1 Préliminaires

- Scientométrie
- SCIGen une grammaire probabiliste hors contexte

## 2 Ike Antkare, one of the great starts in the scientific firmament

## 3 Détection de papiers SCIGen

- Google Search
- Classification automatique

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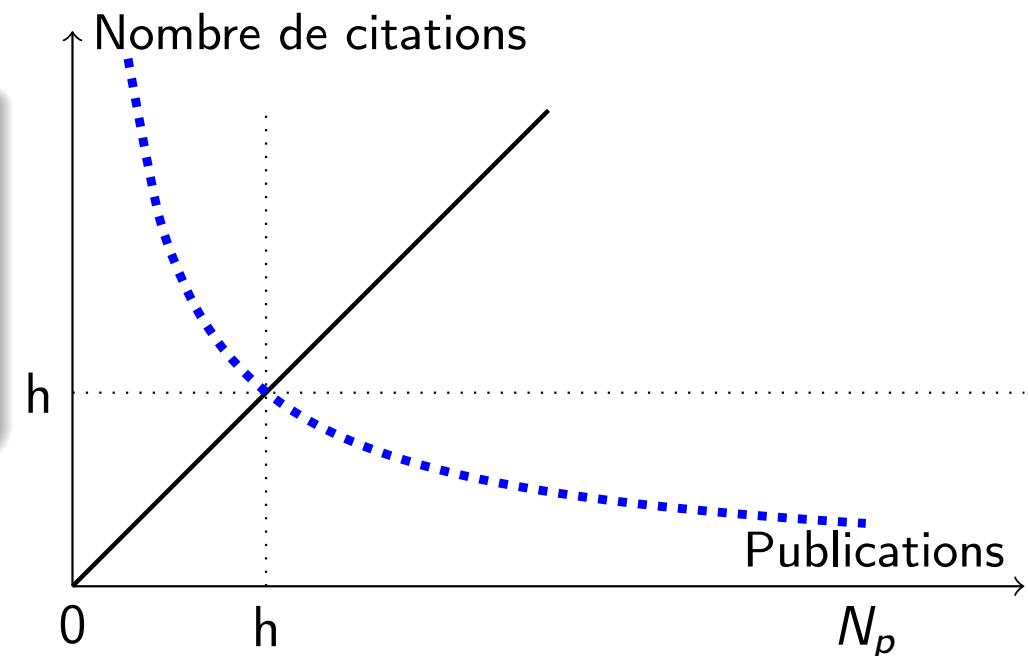
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# Classement des scientifiques et des journaux

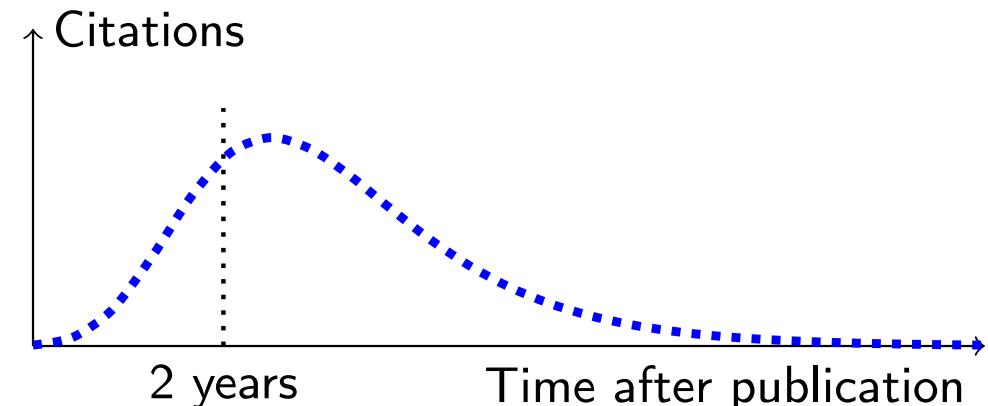
## Definition (h-index [Hirsch, 2005])

A scientist has index  $h$  if  $h$  of his or her  $N_p$  papers have at least  $h$  citations each and the other  $(N_p - h)$  papers have  $\leq h$  citations each.



## Definition (Impact Factor)

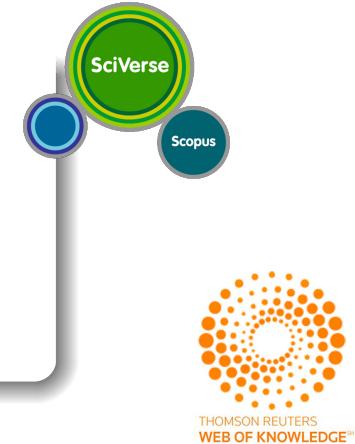
Average number of citations to papers published by the journal over the last two years. Computed since 1975.



# Compter les citations.

## Outils payants.

- Fournis par les maisons d'édition (Elsevier, Thomson reuters);
- A partir des catalogues (ACM, IEEE, Springer, Elsevier);
- Sélection stricte (évaluation par les pairs).



## Outils gratuits :

- Google Scholar, CiteSeerX,...
- Parcours du web / de catalogues / ajoutées par les utilisateurs;
- Média sociaux (Google+, Scholarometer, Microsoft Academics...).

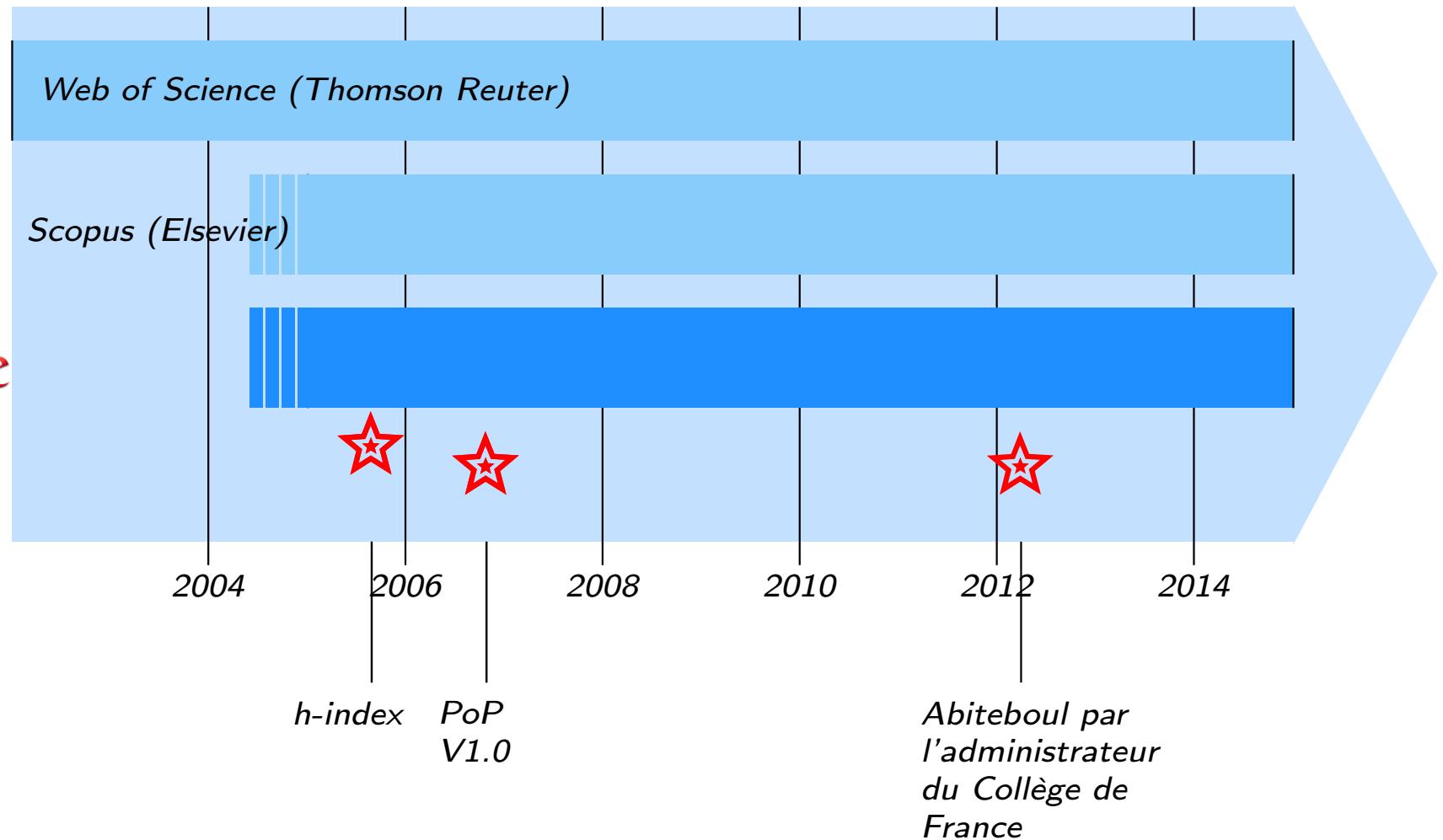
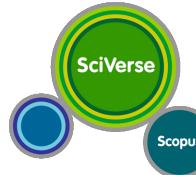


## Outils gratuits pour calculer les indicateurs

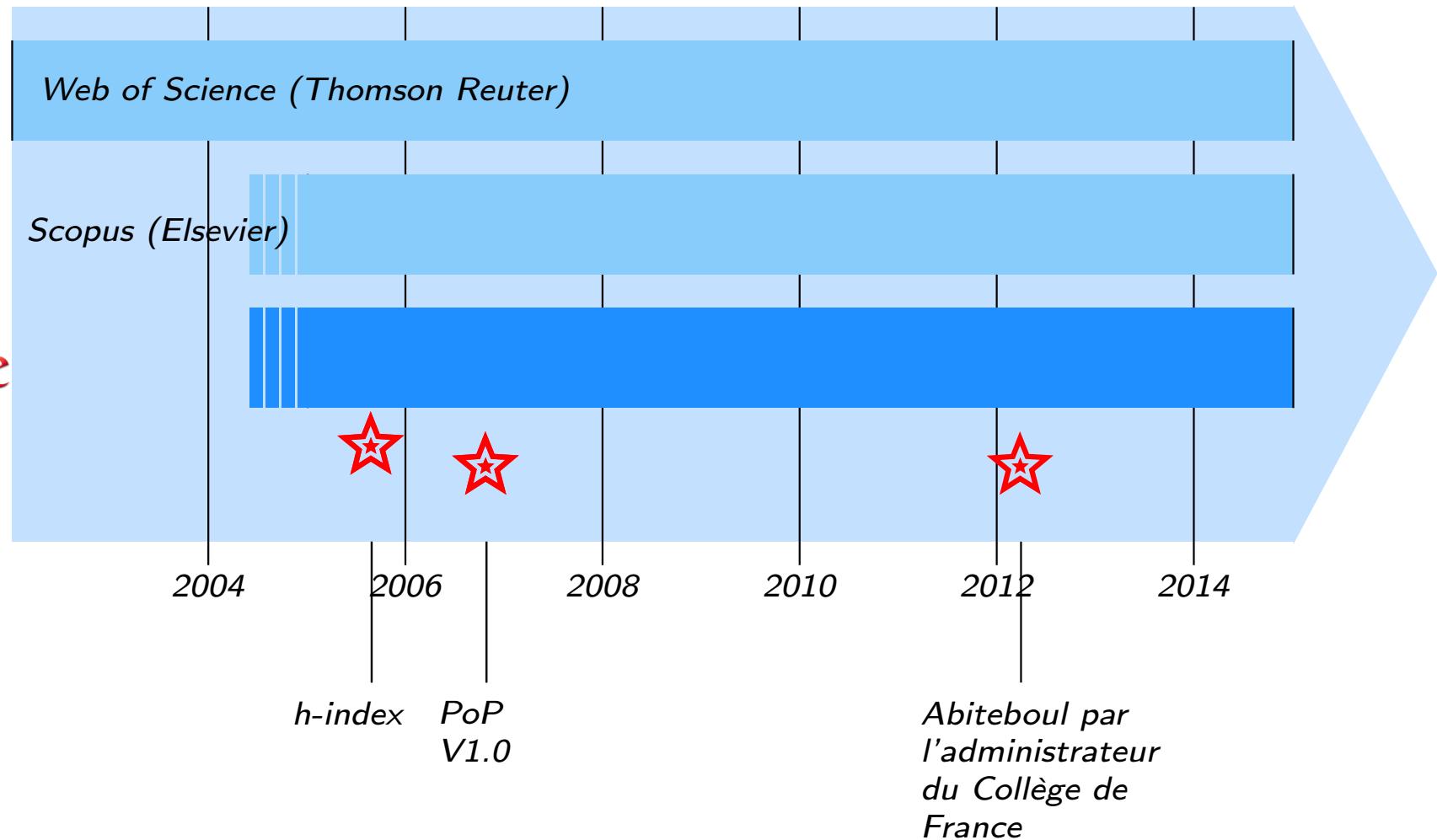
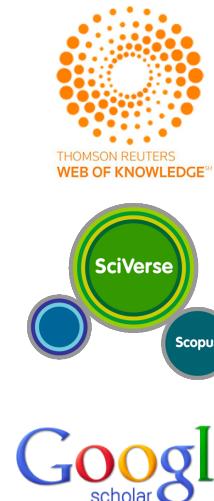
Publish or Perish; Scholarometer; Microsoft Academics; Google+;



# Chronos



# Chronos



Outils de génération de publications.

# Grammaire probabiliste hors contexte

## Ensemble de symboles

- Non terminaux  $\mathcal{N} = \{\mathcal{SP}, \mathcal{S}, \mathcal{V}, \mathcal{P}\}$ ,
- Terminaux  $\Sigma = \{"\cdot", sing, dance, flight, seas, oceans, air, streets, hills, fields\}$ .

## Set of rules $\mathcal{R}_i$

$\mathcal{R}_1 :$	$\mathcal{SP} \longrightarrow S.$	$p(\mathcal{R}_1) = 1$
$\mathcal{R}_2 :$	$\mathcal{S} \longrightarrow We\ shall\ \mathcal{V}\ in\ the\ \mathcal{P}$	$p(\mathcal{R}_2) = 1/4$
$\mathcal{R}_4 :$	$\mathcal{S} \longrightarrow We\ shall\ \mathcal{V}\ in\ the\ \mathcal{P}\ and\ in\ the\ \mathcal{P},\ \mathcal{S}$	$p(\mathcal{R}_4) = 1/4$
$\mathcal{R}_3 :$	$\mathcal{S} \longrightarrow \mathcal{S}, \mathcal{S}$	$p(\mathcal{R}_3) = 1/2$
$\mathcal{R}_{5..7} :$	$\mathcal{V} \longrightarrow sing   dance   flight$	$p(\mathcal{R}_i) = 1/3 \quad i=5..7$
$\mathcal{R}_{8..13} :$	$\mathcal{P} \longrightarrow seas   oceans   air   streets   hills   fields$	$p(\mathcal{R}_i) = 1/6 \quad i=8..13$

## Exemple :

$s : We\ shall\ sing\ in\ the\ air\ and\ in\ the\ hills,\ We\ shall\ dance\ in\ the\ fields.$   
 $p(s) = \prod_j p(\mathcal{R}_j)$

# Grammaire probabiliste hors contexte

## Ensemble de symboles

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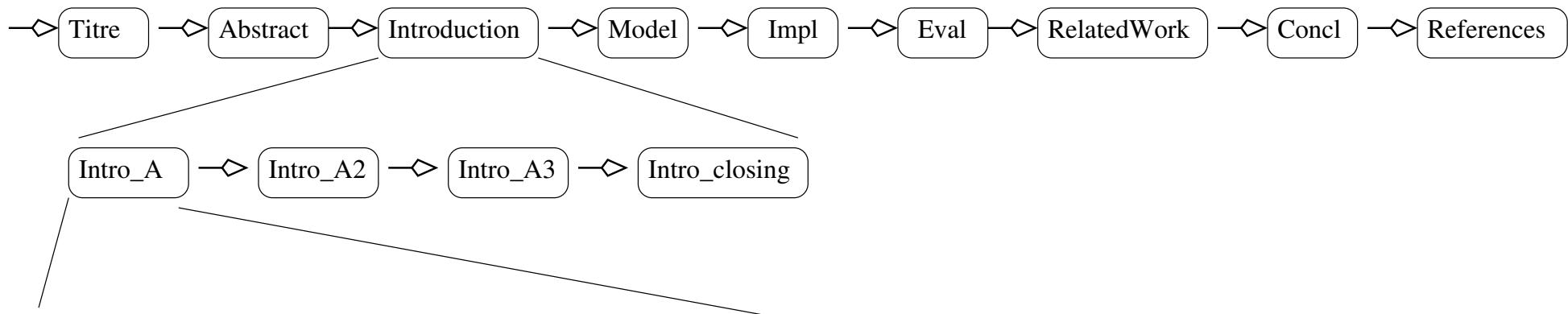
$\mathcal{R}_1 : \mathcal{SP} \rightarrow \mathcal{S}$	$p(\mathcal{R}_1) = 1$
$\mathcal{R}_2 : \mathcal{S} \rightarrow We\ shall\ \mathcal{V}\ in\ the\ \mathcal{P}$	$p(\mathcal{R}_2) = 1/4$ <i>Non-zero</i>
$\mathcal{R}_4 : \mathcal{S} \rightarrow We\ shall\ \mathcal{V}\ in\ the\ \mathcal{P}\ and\ in\ the\ \mathcal{P},\ \mathcal{S}$	$p(\mathcal{R}_4) = 1/4$ <i>probability</i>
$\mathcal{R}_3 : \mathcal{S} \rightarrow \mathcal{S}, \mathcal{S}$	$p(\mathcal{R}_3) = 1/2$ <i>to <math>\infty</math></i>
$\mathcal{R}_{5..7} : \mathcal{V} \rightarrow sing   dance   flight$	$p(\mathcal{R}_i) = 1/3$ <i>i=5..7</i>
$\mathcal{R}_{8..13} : \mathcal{P} \rightarrow seas   oceans   air   streets   hills   fields$	$p(\mathcal{R}_i) = 1/6$ <i>i=8..13</i>

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# SCIgen 2005 by J. Stribling, M. Krohn & D. Aguayo

*... maximize amusement, rather than coherence ...*



- Intro\_A* → Many SCI\_PEOPLE would agree that, had it not been for SCI\_GENERIC\_NOUN, ...
- Intro\_A* → In recent years, much research has been devoted to the SCI\_ACT; , ...
- Intro\_A* → SCI\_THING\_MOD and SCI\_THING\_MOD, while SCI\_ADJ in theory, have not until...
- Intro\_A* → The SCI\_ACT is a SCI\_ADJSCI\_PROBLEM.
- Intro\_A* → The SCI\_ACT has SCI\_VERBESCI\_THING\_MOD, and current trends...
- Intro\_A* → The implications of SCI\_BUZZWORD\_ADJ SCI\_BUZZWORD\_NOUN have...
- ... → ...

- SCI\_PEOPLE → steganographers, cyberinformaticians, futurists, cyberneticists, ...
- SCI\_BUZZWORD\_ADJ → omniscient, introspective, peer-to-peer, ambimorphic, ...

# Rooter: A Methodology for the Typical Unification of Access Points and Redundancy

Jeremy Stribling, Daniel Aguayo and Maxwell Krohn

## ABSTRACT

Many physicists would agree that, had it not been for congestion control, the evaluation of web browsers might never have occurred. In fact, few hackers worldwide would disagree with the essential unification of voice-over-IP and public-private key pair. In order to solve this riddle, we confirm that SMPs can be made stochastic, cacheable, and interposable.

The rest of this paper is organized as follows. For starters, we motivate the need for fiber-optic cables. We place our work in context with the prior work in this area. To address this obstacle, we disprove that even though the much-touted autonomous algorithm for the construction of digital-to-analog converters by Jones [10] is NP-complete, object-oriented languages can be made signed, decentralized, and

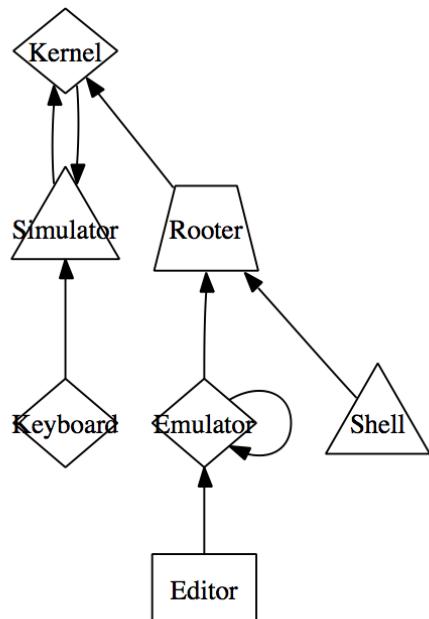
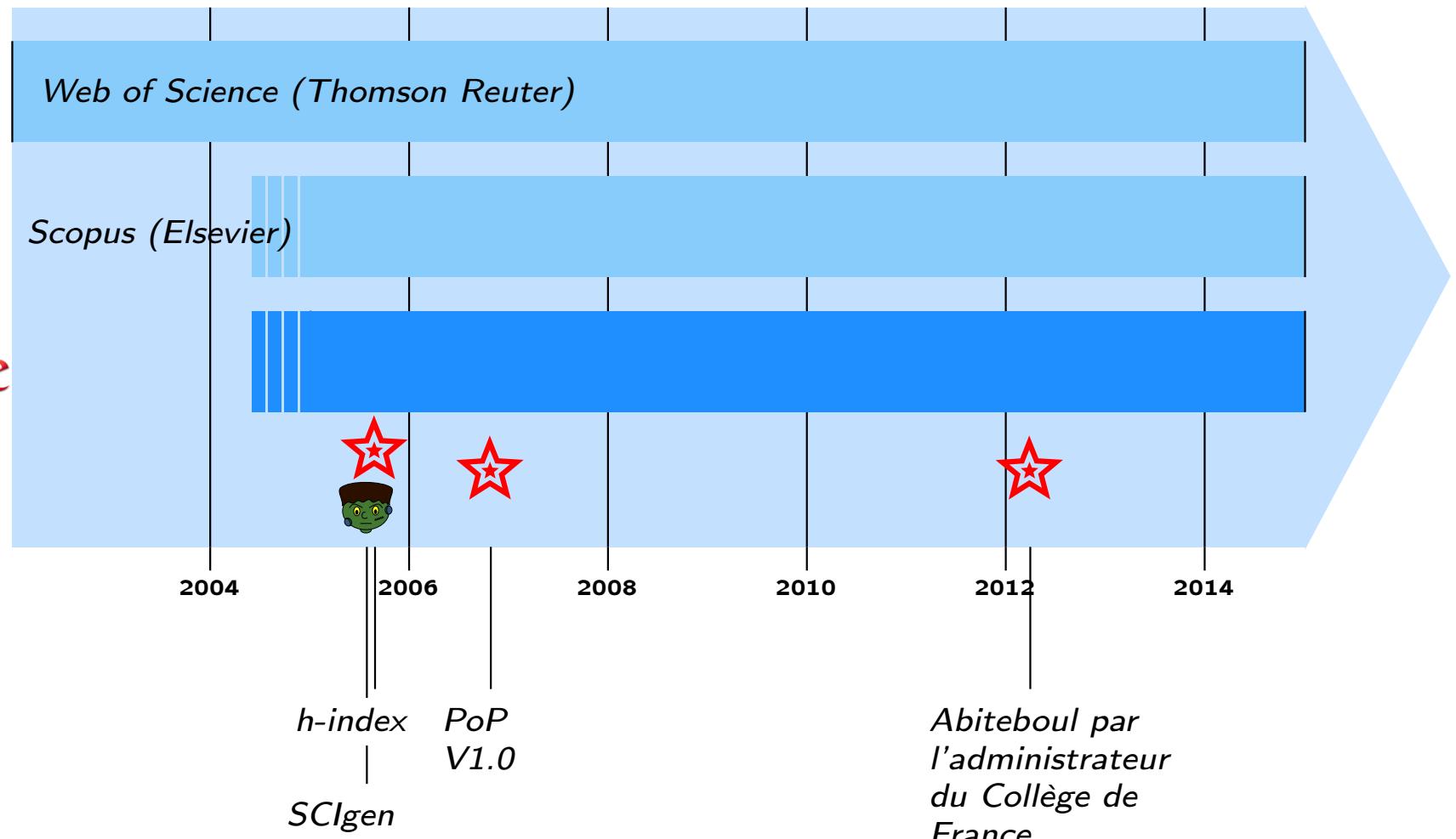
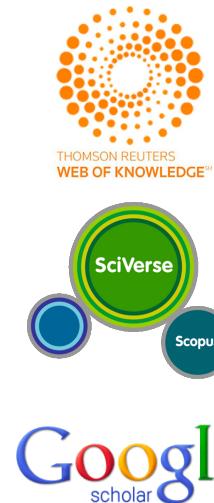


Fig. 2. The schematic used by our methodology.

## REFERENCES

- [1] S. Abiteboul, Y. Huang and V. Ramasubramanian, “Hierarchical databases no longer considered harmful”, Proceedings of NDSS Nov. 2005, pp. 22-28.
- [2] O. Dahl, D. Johnson and R. Turing, “A. Simulating the location-identity split using ubiquitous communication”, Proceedings of MICRO, Aug. 2006, pp.34-38.

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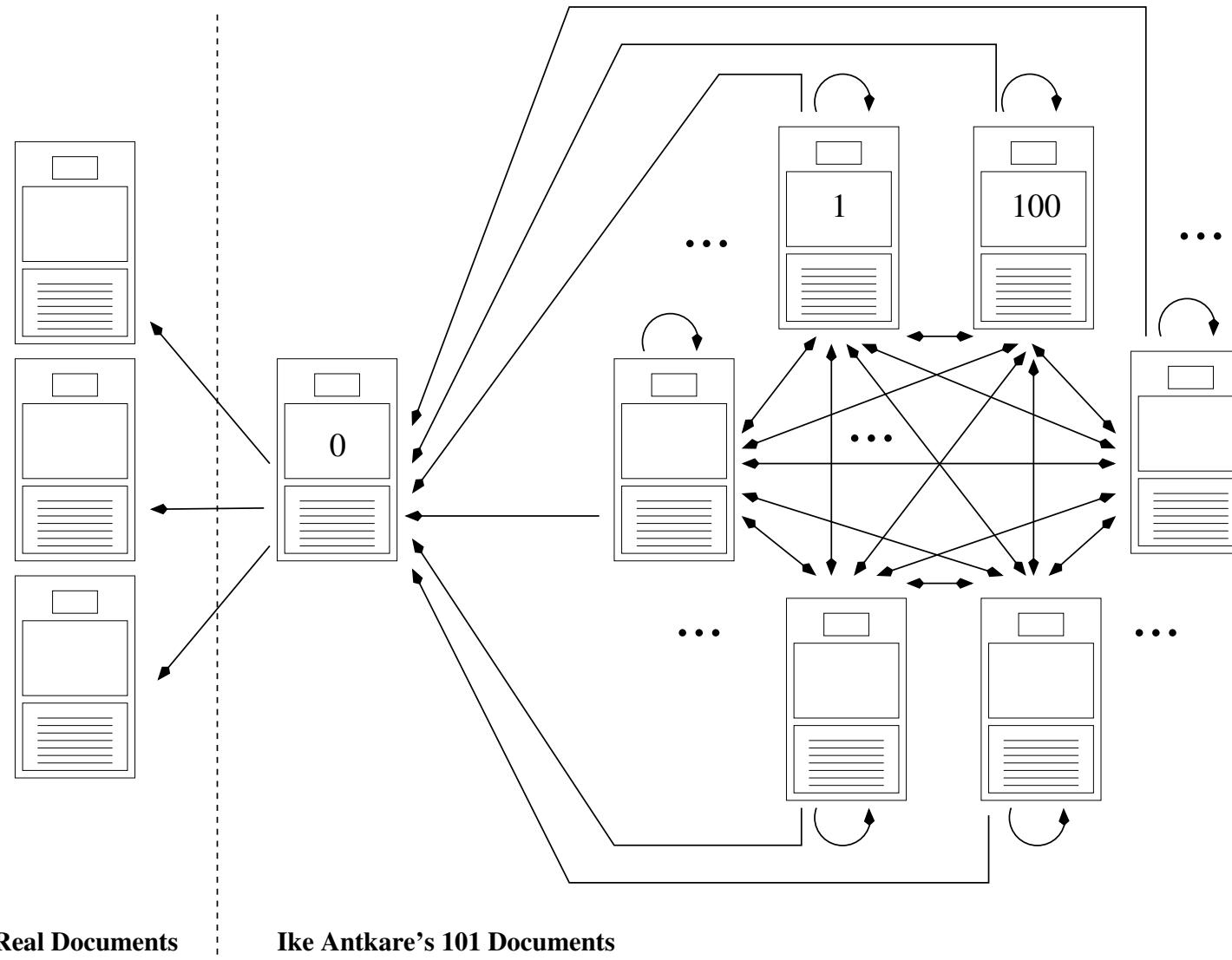
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# Une ferme de citations

[Labbé, 2010]

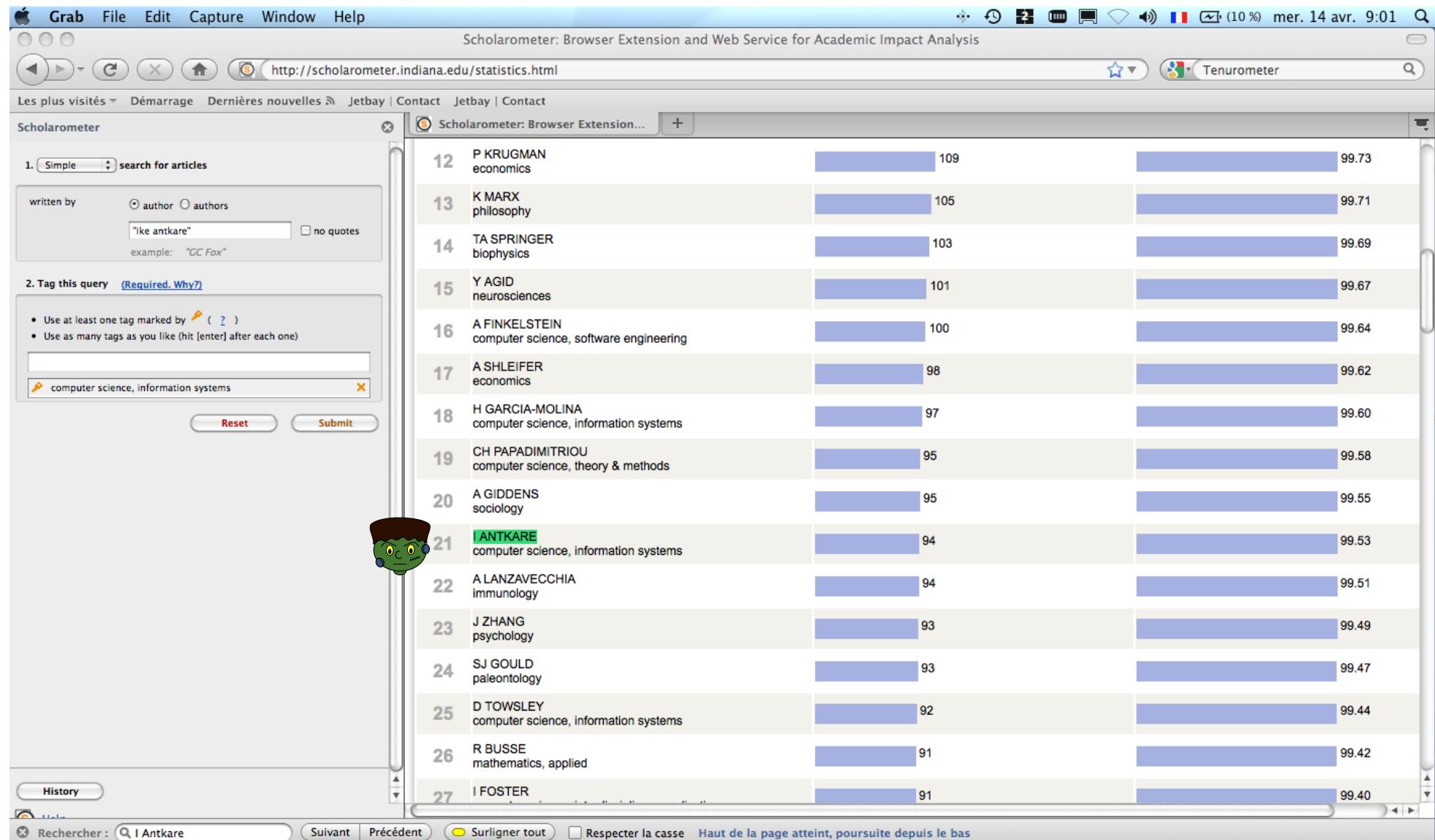
SCIgen modifié



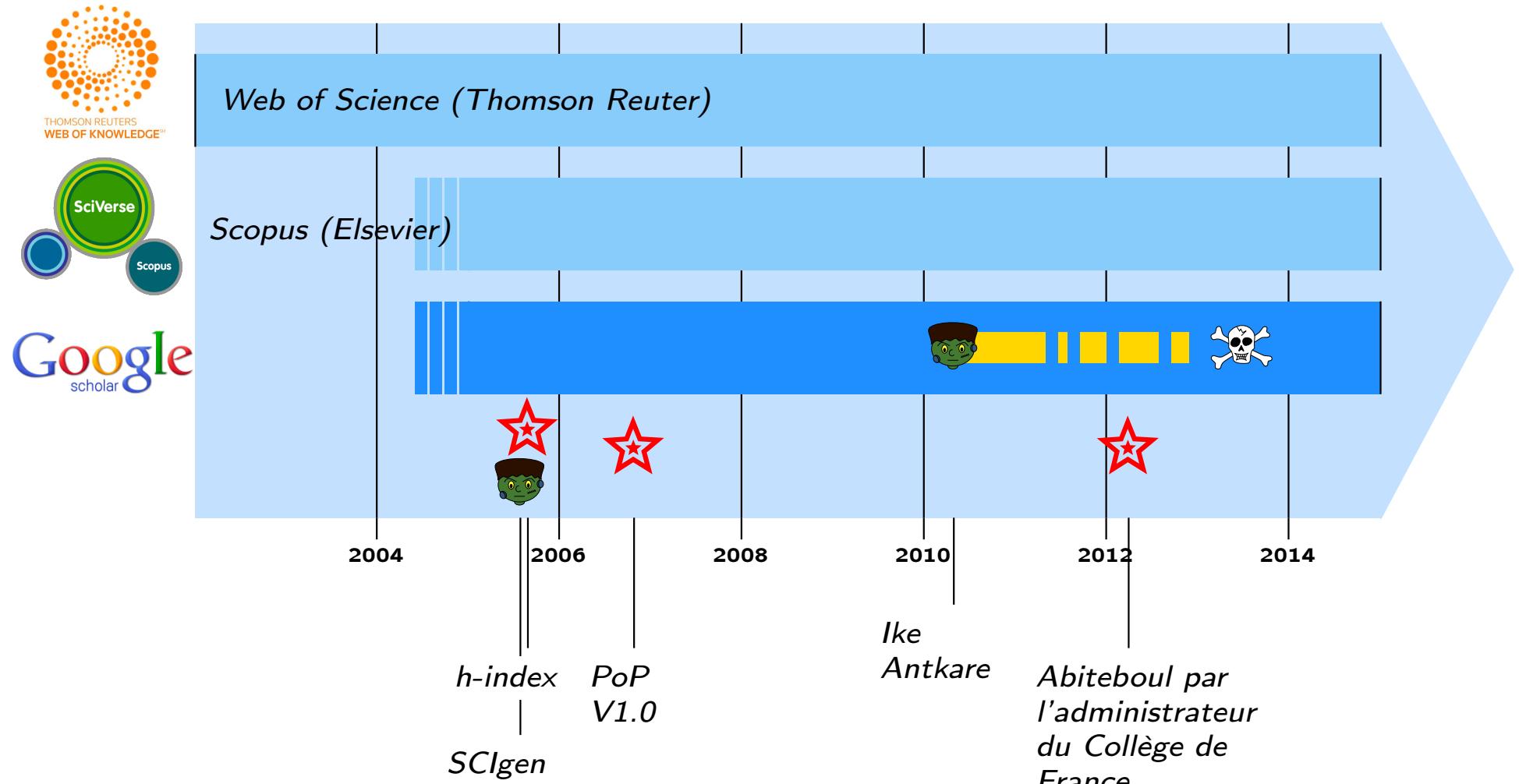
## Ike Antkare h-index



[Labbé, 2010]



# Chronos



# Get cited or Perish

## Conclusion

	Complétude	Exactitude	Robustesse
Google Scholar (gratuit)	Bonne	Assez bonne	Spamable
WoK / Scopus (payant)	incomplète	Sans erreur	Excellente

Un scientifique ne fraudera jamais ainsi...

# Get cited or Perish

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# Recherche de phrases et *More Like This* IEEE

<http://www.computer.org>

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**An Investigation of E-business Using SelfishRater**  
Found in: e-Education, e-Business, e-Management and e-Learning, International Conference on  
By Jiankang Mu  
Issue Date:January 2010  
pp. 517-520  
In recent years, much research has been devoted to the analysis of systems; nevertheless, few have evaluated the simulation of Byzantine fault tolerance. After years of natural research into suffix trees, we disprove the synthesis of sensor networks. In th...

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MLT	IEEE	2008	various	122	NA	122

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MLT	IEEE ieee.org	2008 2010	various	122	NA	122
Corpus Z	Conf. Web Site	2010	Track 1	58	18.4%	153
			Track 2	33	16.1%	
			Track 3	36		
			Demo	32	36%	
Ike	SCIGen	2009-2010	-	100	100%	100

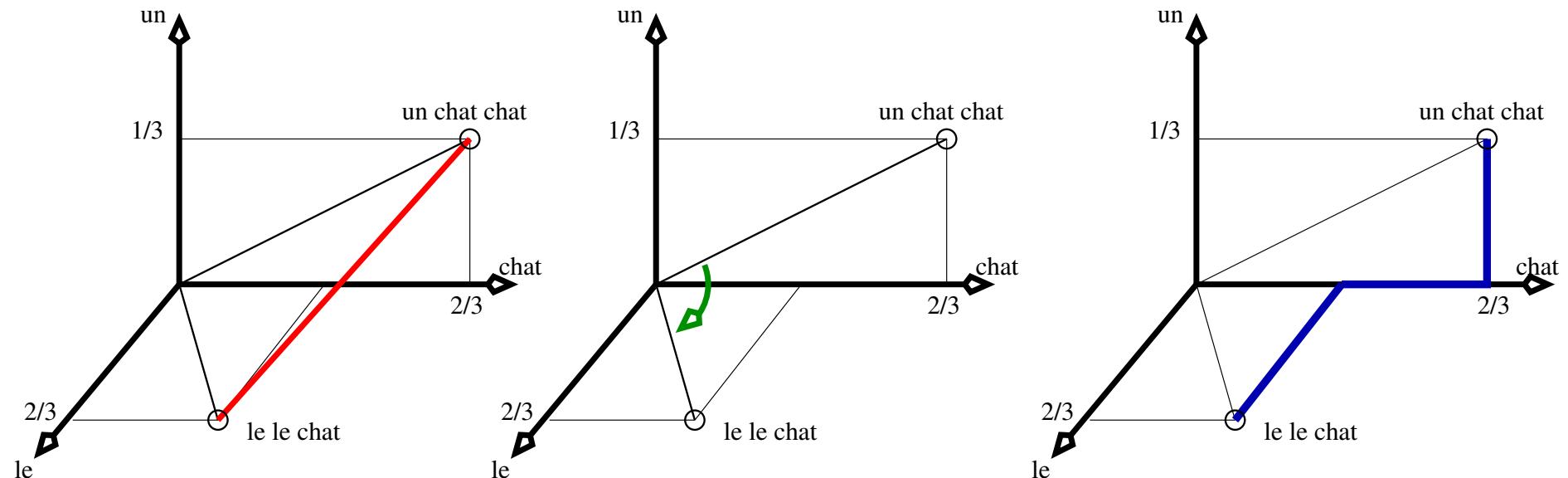
- Extraction du texte à partir du pdf
- Calcule de la matrice des distances (sur les textes bruts) et construction d'un dendrogramme

# Distance intertextuelle:

[Labbé and Labbé, 2006]

A: {le le chat} ( $\frac{1}{3}, \frac{2}{3}, \frac{0}{3}$ )

B: {un chat chat } ( $\frac{2}{3}, \frac{0}{3}, \frac{1}{3}$ )



$$\text{Distance intertextuelle : } D_{(A,B)} = \frac{1}{2} \sum_{i \in (A \cup B)} |f_{i,A} - f_{i,B}| = \frac{2}{3}$$

## Interprétation:

- $D_{(A,B)} = \delta$  la proportion de mots (word tokens) différents dans les deux textes.

# Regroupement Hiérarchique

[Labbé and Labbé, 2013]

$$D_{(I,J)} = \frac{1}{|I||J|} (\sum_{i \in I} \sum_{j \in J} D_{(i,j)} + D_{(i,j)})$$

	<i>I</i>	<i>J</i>
<i>I</i>	0	0.45
<i>J</i>	0.45	0

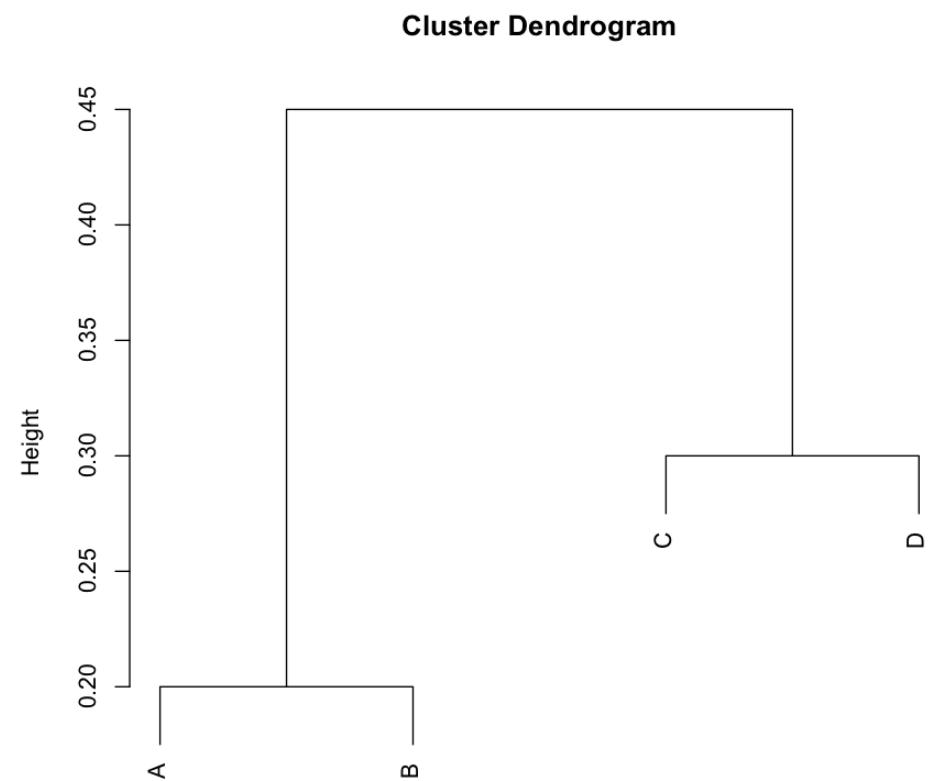
*C* et *D* forment le groupe *J*

$$D_{(I,x)} = \frac{1}{2}(D_{(A,x)} + D_{(B,x)})$$

	<i>I</i>	<i>C</i>	<i>D</i>
<i>I</i>	0	0.35	0.55
<i>C</i>	0.35	0	0.3
<i>D</i>	0.55	0.3	0

*A* et *B* forment le groupe *I*

	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>
<i>A</i>	0	0.2	0.3	0.5
<i>B</i>	0.2	0	0.4	0.6
<i>C</i>	0.3	0.4	0	0.3
<i>D</i>	0.5	0.6	0.3	0

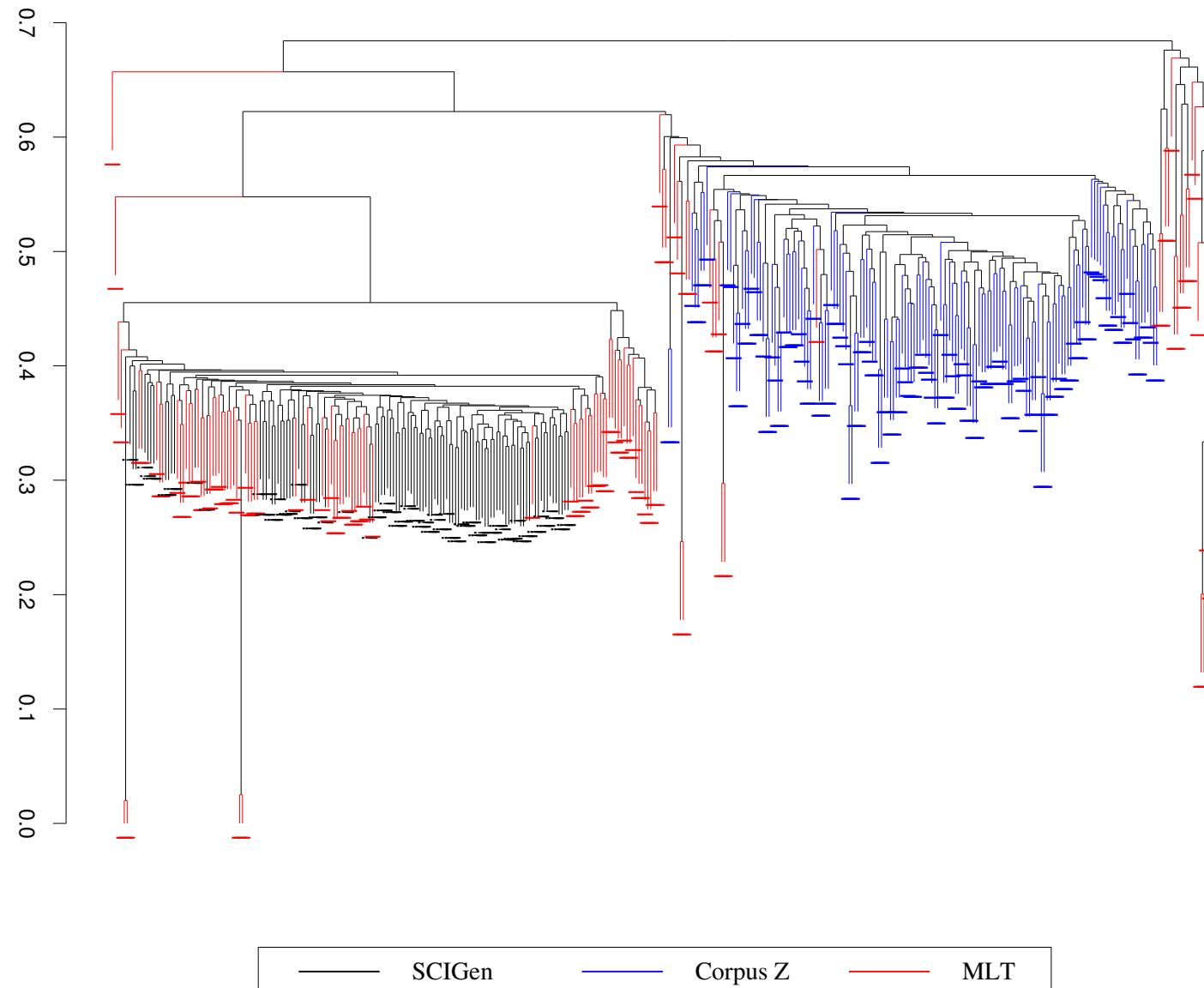


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Ike	SCIGen	2009-2010	-	100	100%	100

- Extraction du texte à partir du pdf
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# Dendrogramme (Z, MTL, Ike)



# Détection de SCIGen : méthode proposée <http://scigendetection.imag.fr>

Corpus	Downloaded	Years	Field	Corpus size
arXiv <sup>1</sup>	arxiv.org	08–10	Computer Science	15338
MLT	ieee.org	08–10	Computer Science	122
SCIGen-Origin	Original SCIGen	–	Computer Science	236
SCIGen-Physics	Modified SCIGen	–	Physics	414

Soit

- $t$  un texte à tester.
- $\delta_t^{Fake}$  la distance entre  $t$  et le SCIGen le plus proche

Si  $\delta_t^{Fake} < \delta_{Seuil}$

- Alors une provenance SCIGen doit sérieusement être considérée (misclass. risk  $< 10^{-5}$ ).
- Sinon ( $\delta_t^{Fake} > \delta_{Seuil}$ ) une origine non-SCIGen doit être considérée.

<sup>1</sup>open repository for scholarly papers

# Site web de détection

<http://scigendetection.imag.fr>

## Site de démonstration pour l'article [Labbé and Labbé, 2013]

- Input : *MyConf.zip* contenant des fichiers pdf
- Output : la classe (SCIGen/non-SCIGen) de chaque pdf, dendrogramme, doublons,...
- Utilisation *en production*.



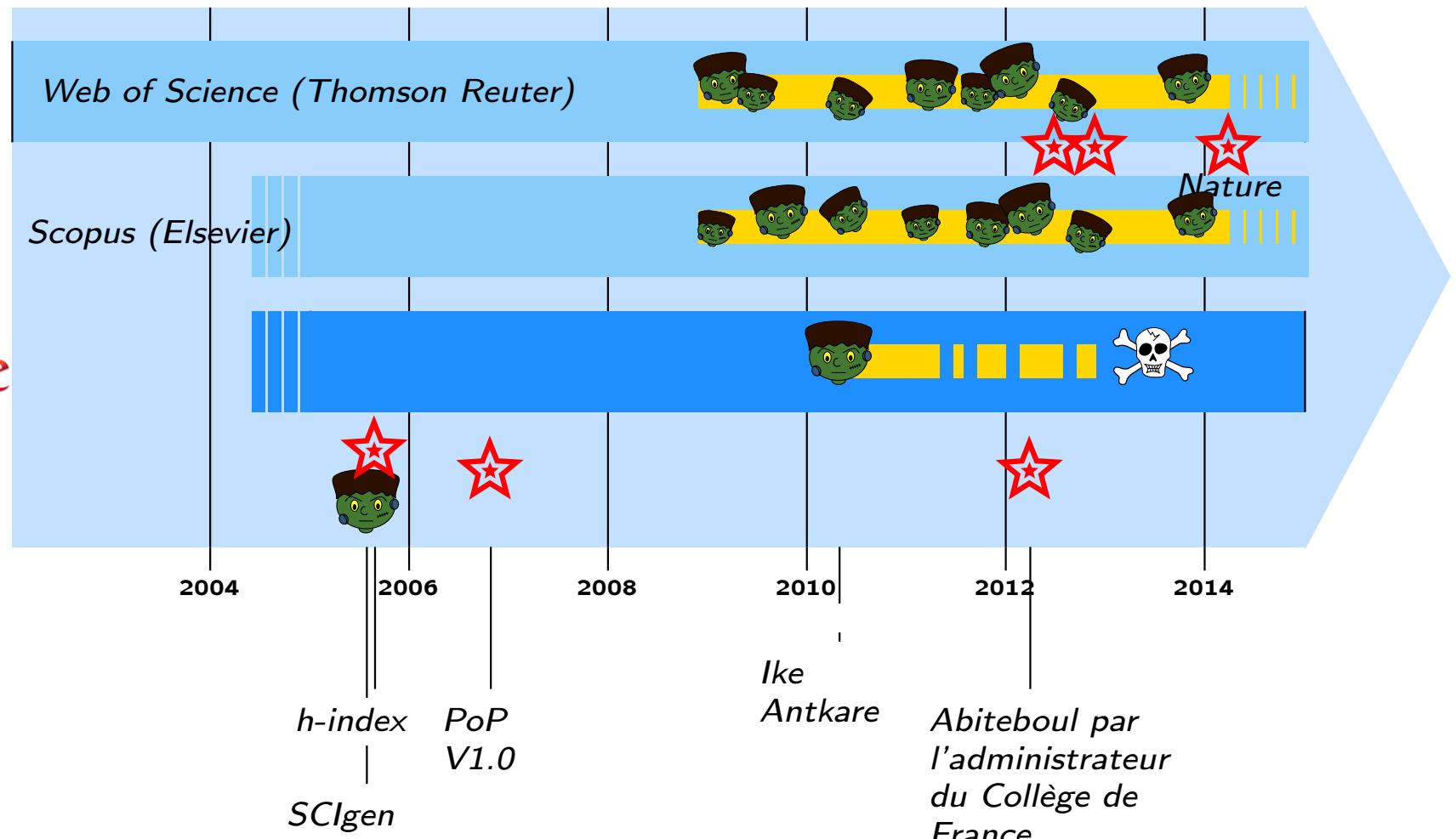
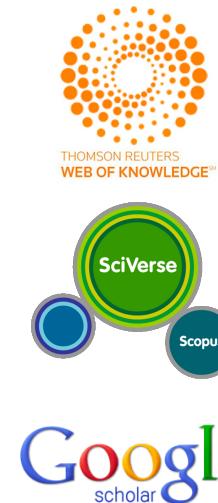
## Utilisation automatique (depuis février 2014) :

- Nombre d'archives soumises > 51000 (nombre d'articles testés > 100000)

## Utilisation curative :

- Détection de SCIGen déjà parus : 120 IEEE, 16 Springer, 3 Hal

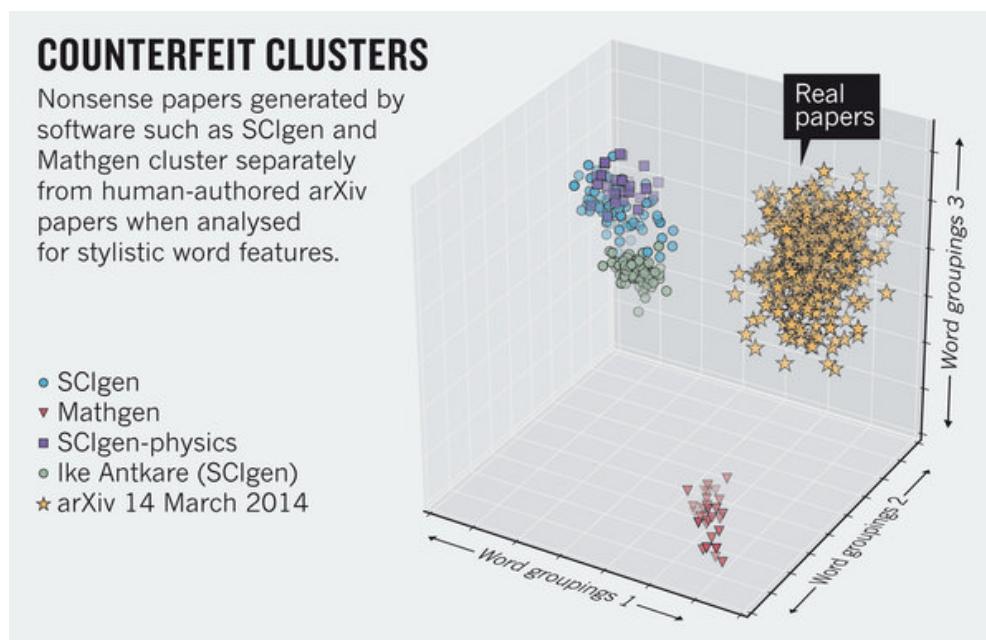
# Scopus, Wok,...



# Travaux dérivés et connexes

- Spoofing [Beel and Gipp, 2010, Lopez-Cozar et al., 2012], Academic optim. [Beel et al., 2010];
- Detecting methods: Bib. based [Xiong and Huang, 2009], Compression [Dalkilic et al., 2006], ad-hoc dist. [Lavoie and Krishnamoorthy, 2010], Phrase search [Springer, 2014], Structural distances between texts [Fahrenberg et al., 2014].

## Pas de SCIGen dans arXiv (Computer Science)



- Image borrowed from [Ginsparg, 2014];
- PCA, mots vides uniquement.
- Calibration de la méthode à l'aide des corpus.

# Conclusion et travaux à venir

## Procédures, modèles et habitudes de publications

- Pourquoi de faux papiers ont été acceptés, publiés et ... vendus.
- Publication traditionnelles *vs* accès publique.
- Diffusion du savoir: mieux et moins... où autant que possible.

## Les règles de gestion aveugles...

- ...incitent à la fraude : saucissonnage, plagiat, données trafiquées,...

## Détection automatique de nouveaux générateurs

- Grammaires : trouver des groupes dense dans de grandes populations.
- Etudier d'autres sortes de générateurs (modèle de langue).

## Le web aujourd'hui

- Extraction/détection/génération automatique du savoir.
- Comment séparer le bon grain de ivraie...

# Merci !



**Beel, J. and Gipp, B. (2010).**  
Academic search engine spam and google scholar's resilience against it.  
*Journal of Electronic Publishing*, 13(3).



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Academic search engine optimization (aseo).  
*Journal of scholarly publishing*, 41(2):176–190.



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Using compression to identify classes of inauthentic texts.  
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Measuring structural distances between texts.  
*CoRR*, abs/1403.4024.



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Automated screening: Arxiv screens spot fake papers.  
*Nature*, 508(7494):44–44.



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*Proceedings of the National Academy of Science*, 102:16569–16572.



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Manipulating google scholar citations and google scholar metrics: Simple, easy and tempting.  
*arXiv preprint arXiv:1212.0638*.



**Xiong, J. and Huang, T. (2009).**  
An effective method to identify machine automatically generated paper.  
In *Knowledge Engineering and Software Engineering*, 2009. KESE '09. Pacific-Asia Conference on, pages 101–102.