

# Cross-lingual similarity calculation for plagiarism detection and more – Tools and resources

## Ralf Steinberger

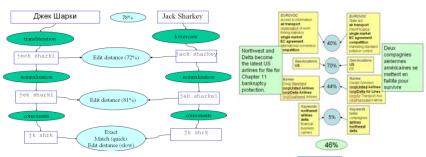
European Commission – Joint Research Centre (JRC) http://langtech.jrc.ec.europa.eu/



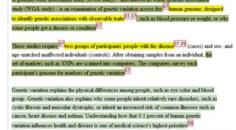
# Agenda



- EC-Joint Research Centre (JRC) Who we are
- Monolingual plagiarism detection (PD) work at the JRC
- Cross-lingual similarity calculation at the JRC
  - Named entity (NE) matching across languages
  - Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
- Summary







#### Bashar Assad

Bashar al-Assad; Bashar

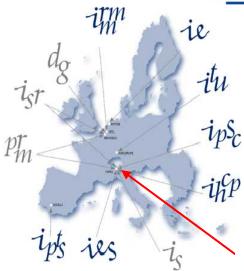


Beather All Asad, Belar Asad, Beat al Asad, Beather et Asad, Beather al-Asad, Begin Erad, Beatri al Asad, Desper Esad, Beather al-Assad, Beather Asad, Beat

# JRC - Who we are







BRUSSELS (BE)

The Directorate General (DG)

The Institutional and Scientific Relations Directorate (ISR)

The Programme and Resource Management Directorate (PRM)

The Institute for Reference Materials and Measurements (IRMM)

The Institute for Transuranium Elements (ITU)

ISPRA (IT) Download the Ispra site Brochure (English - Italian) The Institute for the Protection and Security of the Citizen (IPSC) The Institute for Environment and Sustainability (IES)

The Institute for Health and Consumer Protection (IHCP)

The Ispra site Directorate (IS)

PETTEN (NL)
The Institute for Energy (IE)

SEVILLE (E)

The Institute for Prospective Technological Studies (IPTS)



**European Commission** (scientific-technical arm of public administration)

- Non-commercial
- Multi-disciplinary / multilingual
- Main product: Europe Media Monitor (EMM)

# **Europe Media Monitor**



## EMM - A few facts



- ~ 3600 Sources (world-wide, with focus on Europe)
- In-depth analysis in 20 languages (NewsExplorer)
- 24/7, updated every 10 minutes
- Freely accessible via <a href="http://emm.newsbrief.eu/overview.html">http://emm.newsbrief.eu/overview.html</a>
- Articles are fed into the various EMM applications:



Steinberger Ralf, Bruno Pouliquen & Erik van der Goot (2009). An introduction to the Europe Media Monitor Family of Applications. In: Fredric Gey, Noriko Kando & Jussi Karlgren (eds.): Information Access in a Multilingual World - Proceedings of the SIGIR 2009 Workshop (SIGIR-CLIR'2009), pp. 1-8. Boston, USA. 23 July 2009.

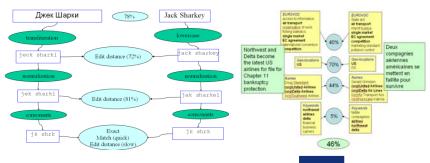
# Agenda







- Monolingual plagiarism detection (PD) work at the JRC
- Cross-lingual similarity calculation at the JRC
  - Named entity (NE) matching across languages
  - Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
- Summary



#### Bashar Assad

ssad; Baschar el-Assad; Begir Ead; Bashir al Assad; Başer Ead; Bashar al-Assad; Bashir Al ssad; Bashar Asad; Bashar el Assad; Begar Esad; Baszra Asads; Baschir Assad; Bashir Alsa slahar El-Asad; Bashar el-Asad; Bashar el-Asad; Bashar el-Asad; Baschar al-Assad; Bashar slahar El-Asad; Bashar el-Asad; Bashar el-Asad; Baschar el-Asad; Baschar el-Assad; Bashar slahar el-Asad; Bashar el-Asad; Bashar el-Asad; Baschar el-Assad; Baschar el-Assad; Baschar el-Assad; Bashar slahar el-Asad; Bashar el-Asad; Bashar el-Asad; Baschar el-Assad; Baschar el-Assad; Baschar el-Asad; Baschar el-Asad;

# Monolingual PD work



# at the JRC (1)

- N-gram overlap between pairs of documents
  - Karp-Rabin algorithm, using word 5-grams
  - to weed out duplicates in the IAEA document database (ca. 350K documents)
  - to find news article near-duplicates in EMM (applied to all news clusters)

Shares of the world's largest tobacco company tumbled almost 14 per cent | The world's largest tobacco company it said it was not in the position to to \$37 03 after it said it was not in the position to confirm its previous confirm its earlier projection of 8 10 per cent growth in underlying earnings projection of 8 10 per cent growth in underlying earnings per share next per share next year year Bit Philip Morris said itstill expected to meet its recently reduced target of 3-5 per centearnings per share growth this year | Bit Philip Morris said itstill expected to meet its recently reduced target of 3-5 per centearnings per share growth this year it would give guidance for 2003 at its next results announcement in January it would give guidance for 2003 at its next results announcement in January The warning to a Morgan Stanley investors conference came six weeks. The warning to a Morgan Stanley investors conference came six weeks after after Philip Morris said earnings growth this year would be much lower than Philip Morris said earnings growth this year would be much lower than its its original expectations of at leastz 9 per cent original expectations of at least 9 per cent It comments also hit rivals share prices with RJ Reynolds down 11 4 per Philip Morris shares closed at \$37 03 and its rivals were also affected with RJ cent at \$37 83 and UST the biggest US maker of snuff and chewing Reynolds down 11 4 per cent at \$37 83 and UST the biggest US maker of tobacco down 7 5 per cent at \$29 89 snuff and chewing tobacco down 7 5 per cent at \$29 89 The maker of Mariboro warned in September that a weak economy, rising excise trues and "beightered consumer throughly were driving smokers towards cheaper brands The maker of Mariboro warned in September that a weak economy, rising excise taxes and "helgide red consumer ring allty" were driving smokers towards cheaper brands That was fuelling growth in cheap imports and illegal cigarette sales and That trend was fuelling the growth in cheap imports and illegal cigarette sales cut price brands made by smaller manufacturers that were partly exempted and cut price brands made by smaller manufacturers that were partly from or in some cases not complying with the 1998 Master Settlement exempted from or not complying with the 1998 Master Settlement Agreement Agreement Under that arrangement, the big manufacturers agreed to pay about \$250b nover 25 years to resolve laws with brought by the Under tratarrangement, the big manufacturers agreed to pay about \$250bn over 25 years to resolve laws uts brought by the 50

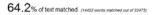
# Monolingual PD work



# at the JRC (2)

## Detection of verbatim plagiarism in research deliverables of EC-funded projects.

- Method: Search for longest (in chars) word 6-grams of each document in EC database and on the web (avoiding strings from document template)
  - If target documents pass similarity threshold:
  - Full-text comparison of matching documents to detect significant matches
  - Visualise document overlap and manually check.
- Contact: Charles Macmillan



# Checked File Details Filename P\_D2.1.pdf

#### **Matching Files**

Ref.	Project	Name	Matching Words	%Suspect	%Source
01		020 technote intelligent snp selection.pdf	842	3.7	38.2
02		Gregersen text.doc	7228	32.2	90.7
03		jama ama-assn.org 1335.full.htm	655	2.9	6.6
04		Mallam The Diagnosis of MS.pdf	0	0.0	0.0
05		Multiple Sclerosis Current Status And Strategies For The Future.pdf	3322	14.8	1.6
06		PSS0505.pdf	148	0.7	0.6
07		wikipedia 20080619 Genome-wide association study.html	358	1.6	41.6
80		www.genome.gov 17516714.htm	862	3.8	60.4
09		www.genome.gov_20019523.htm	613	2.7	39.5
10		www.mged.org_miame_2.0.html	591	2.6	83.9

A genome-wide association study (GWA study) - also known as whole genome association study (WGA study) - is an examination of genetic variation across the  $|\overline{OI}_{\text{human genome, designed}}$  to identify genetic associations with observable traits  $|\overline{O3}, \overline{OI}|$  such as blood pressure or weight, or why some people get a disease or condition  $|\overline{OI}|$ .

These studies require  $\sqrt[07]{}$  two groups of participants: people with the disease  $\sqrt[07,09]{}$  (cases) and sex- and age-matched unaffected individuals (controls). After obtaining samples from an individual, the set of markers such as SNPs are scanned into computers. The computers survey each participant's genome for markers of genetic variation  $\sqrt[07]{}$ .

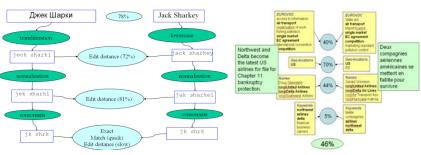
Genetic variation explains the physical differences among people, such as eye color and blood group. Genetic variation also explains why some people inherit relatively rare disorders, such as cystic fibrosis and muscular dystrophy, or inherit an increased risk of common illnesses such as cancer, heart disease and asthma. Understanding how that 0.1 percent of human genetic variation influences health and disease is one of medical science's highest priorities.

# Agenda

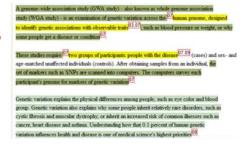




- Monolingual plagiarism detection (PD) work at the JRC
- Cross-lingual similarity calculation at the JRC
  - Named entity (NE) matching across languages
  - Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
- Summary







#### Bashar Assad

Beshar el-Assad; ——"() Barchar el-Assad; Beshar el-Assad;



Bashar Ali Asad, Balar Asad, Bashar Asad, Bashar et al. Asaad, Bashar et Asad, Bayli Erad, Bashir al Asaad, Bashar al-Asasad, Bashar al-Asasad, Bashar Ali Asasad, Bashar Asad, Bashar Asad

# **Cross-lingual similarity**



# **Entity names**



Bashar al-Assad (Eu,yo) (ar) بشار الأسد

Bachar al-Assad (es,pt) Baschar al-Assad (de,nl) Bashar Assad (Eu,sw)

Bashar al Assad (da,sw)

Башар Асад (bg,ru) Beşşar Esad (tr)

Beşar Esad (tr)

Bachar el-Assad (fr,pt)

Bachar al Asad (es,pt) Bashar Al-Assad (da,sw)

Bashar al Asad (es,sw)

Bashar Al Assad (da,tr)

Bachar al Assad (es,pt)

Bachar Al-Assad (es,pt)

Bašar al Asad (sl)

Baschar el Assad (de)

Baschar al Assad (de,es)

Bachar el Asad (es)

Bashir al-Assad (da,sv)

### **Key Titles and Phrases**

syrian president (en - 1322) président syrien (fr - 570) presidente sírio (pt - 271) presidente sirio (es - 205) presidente siriano (it - 202) president (de,sv - 961) syrische president (nl - 133) präsident (de - 446)

präsidenten (de - 223)

síria (pt - 122)

prezydenta (pl - 158)

staatschef (de - 92)

presidente (es,pt - 241)

président (fr - 249) prezydent (pl - 75)

siria (es - 51)

başkanı (tr - 209)

syrien (fr - 39)

predsednika (sl - 55)

staatspräsident (de - 35)

predsednik (sl - 51)

#### **External resources**



Image obtained automatically from Wikipedia

Read Wikipedia entry

# **Cross-lingual similarity**



# **Entity names (2)**



**People and Organisations** 

Daily News Analysis, across languages and over time

## Main Menu

#### **Bashar Assad**

Bashar al-Assad (Eu,yo) بشار الأسد (ar)

Information about this person was last updated on Sunday, September 9, 2012.

News language and date Language or country: en - English Sep 🗸 🗦 2012 🔻 🗦 1 2

News Summary About EMM NewsExplorer

Bachar al-Assad (es,pt)
Baschar al-Assad (de,nl)
Bashar Assad (Eu,sw)
Bashar Assad (Eu,sw)
Bashar al Assad (da,sw)
Bawap Acaд (bg,ru)
Bessar Esad (tr) Beşar Esad (tr) Beşar Esad (tr.)
Bachar el-Assad (fr.pt)
Bachar al Asad (es.pt)
Bashar Al-Assad (da.sw)
Bashar al Asad (es.sw)
Bashar al Assad (da.tr)
Bachar al Assad (es.pt)
Bachar Al-Assad (es.pt)
Bachar Al-Assad (es.pt)
Bachar Al-Assad (sp.pt) 3 4 5 6 7 8 9 Bašar al Asad (sl) Baschar el Assad (de)
Baschar el Assad (de,es)
Baschar el Assad (de,es)
Bachar el Assad (es)
Bashir al-Assad (da,sv) 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30

Key Titles and Phrases syrian president (en - 1322) président syrien (fr - 570) presidente sírio (pt - 271) presidente sírio (es - 205) presidente sirio (es - 205)
presidente siriano (it - 202)
president (de,sv - 961)
syrische president (nl - 133)
präsident (de - 446)
präsidenten (de - 223)
siria (pt - 122)
prezydenta (pl - 158)
staatschef (de - 92)
presidente (es,pt - 241)
président (fr - 249)
prezydent (pl - 75)
siria (es - 51)
bagkanı (tr - 209) sırıa (es - 51)
başkanı (tr - 209)
syrien (fr - 39)
predsednika (sl - 55)
staatspräsident (de - 35)
predsednik (sl - 51)

Related People
Kofi Annan (2693)
Ban Ki Moon (1800)
Sergei Lavrov (1507)
Hillary Rodham Clinton (1474
Barack Obama (1354)
Recep Tayyip Erdogan (981)
Nabil Elaraby (887)
Vladimir Putin (838)
Muammar Gaddafi (808)
Ahmet Davutoglu (805)
Alain Juppé (785)
Abdul Rahman (710)
Walid Muallem (645)
Nicolas Sarkozy (543)
William Hague (531)
Catherine Ashton (511)
Bourhan Ghalioun (509)
Susan Rice (445)
Guido Westerwelle (434)
David Cameron (413)
Victoria Nuland (402)
François Hollande (390)
Laurent Fabius (384)
Robert Mood (379)
Mahmoud Ahmadinejad (372)
May Pillay (370) Mahmoud Ahmadinejad (372) Navi Pillav (370)

Amer Alkhatib (2.0) Mustafo al Dabija (1.2) Vladimir Petrovich Kochy

# Timeline [en] for 09/2012

 $[de] \ [ar] \ [it] \ [fr] \ [pt] \ [nl] \ [ru] \ [sl] \ [es] \ [da] \ [no] \ [bg] \ [sv] \ [tr] \ [ro] \ [sw]$ State TV reports 6 dead in Damascus 'terrorist' Clinton Tells Russia Sanctions Will End, but cnn 08-SEP-12

Hu makes pledge on Chinese growth bbc 08-SEP-12

Double 'terror' blasts reported in Damascus cnn 07-SEP-12

What you need to know about Syria today cnn 06-SEP-12

settlement in Syria itartass\_en 07-SEP-12 Vladimir Putin accuses Britain and US of double standards telegraph 06-SEP-12

Russia named the conditions for a peace

26 PKK members killed in military operation in SE

Congress May Disagree IHT 08-SEP-12

Turkey xinhuanet\_en 08-SEP-12

# Multilingual NER





- death of former Prime Minister Rafik Hariri, blamed by many opposition en
- asesinato del exprimer ministro Rafic al-Hariri, que la oposición atribuyó es
- l'assassinat de l'ex-dirigeant Rafic Hariri et le départ du chef de la diplom fr
- na de moord op oud-premier Rafig al-Hariri gingen gisteren bijna een nl
- de libanesischen Regierungschef Rafik Hariri vor einem Monat wichtige B
- danjega libanonskega premiera Rafika Haririja. Libanonska opozicija si sl
- möödumisele ekspeaminister Rafik al-Hariri surma põhjustanud pommipl et
- اغتيال رئيس الوزراء السابق رفيق الحريري بأياد يهودية وما حدث سابقا ar
- Бывший премьер-министр Ливана Рафик Харири, который ru

# Merging name variants



 For all newly found name forms, detect whether they are a variant of an existing NE:

Ralf & Bruno Pouliquen (2009). Cross-lingual Named Entity Recognition. In: Satoshi Sekine & Elisabete Ranchhod (eds.): Named Entities Recognition, Classification and Use, Benjamins Current Topics, Volume 19, pp 137-164. John Benjamins Publishing Company. ISBN 978-90-272-8922 3

- Transliteration;
- Normalisation, using ~30 hand-written rules and removing vowels;
- Calculate similarity (threshold: 94%).

 Below threshold → new entity Джек Шарки Jack Sharkey 78% lowercase transliteration jack sharkey jeck sharki Edit distance (72%) 20% normalisation normalisation jek sharki jak sharkei Edit distance (81%) 80% consonants consonants Exact jk shrk jk shrk Condition: Match (quick) Edit distance (slow)

# Add Wikipedia variants



- For frequent or highly visible names, manually launch a Wikipedia mining process.
  - Check for each variant of a name whether there is a Wikipedia entry.
  - New name variants, in all scripts, will be recognised in new EMM articles.



# Freely available resource



**JRC-Names** 

# Name variant list, including across scripts, and software to recognise names in text

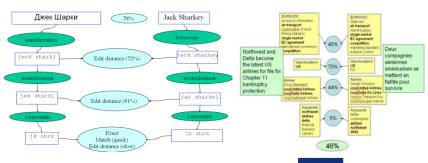


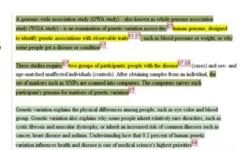
אים (Mouammar Kadhafi; Muammar al-Gaddafi; Moammar Gadhafi; Muammar Gheddafi; Myamap Kadaqi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Moammar Gaddafi; Muammar Khaddafi; Muammar Kaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Gaddafi; Muammar Kaddafi; Muammar Gaddafi; Muammar Gadd

# Agenda



- EC-Joint Research Centre (JRC) Who we are
- Monolingual plagiarism detection (PD) work at the JRC
- Cross-lingual similarity calculation at the JRC
  - Named entity (NE) matching across languages
  - Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
- Summary





### **Bashar Assad**

Beatzer e-Naed, Bacher E-Nasad, Esuapa an-Acaz,
Bacher Assad, Esuar E-Naed, Bacher e-Nasad, Basher
Assad, Bacher e-Nasad, Bacher e-Nasad, Bacher e-Nasad,
Rasher E-Nasad, Bacher e-Nasad, Bacher e-Nasad,
Rasher Basher e-Nasad, Bacher e-Nasad, Bacher e-Nasad,
Bacher Assad, Bacher e-Nasad, Bacher e-Nasad,
Bacher B-Nasad, Bacher e-Nasad, Bacher e-Nasad,
Bacher B-Nasad,
Bacher e-Nasad,
Bacher e-



live





## **Documents**



#### Cross-lingual similarity Documents (2) NewsExplorer Castro quits as president, state-run paper reports [72] de es da et fa no pl pt ro ru de en fr it n گزارش تلویزیون فرانسه از کناره گیری فیدل کاسترو ت کاره گوري فيال کامترو از قارت در کوبا با تطبیکل سياسي خود به گفتگل پرداهت. وان بردار کتابه Fidel Castro announced his resignation as presiq of Cuba and commander-in-chief of Cuba's milit ين تبه کلت در به تعلق پس از فيل کامترو در کيه او ستي پيش اغاز شده است. در 32 زرايه 2006 وي زمام فرت را به برادرش رافل ا on Tuesday, according to a letter published by iranpressnews 13:36:00 o'clock CET state-run newspaper Granma. Kuba: Fidel Castro gibt das Zepter ab en es fr it nl ar bg da et fa no pl pt ro cnn 9:23:00 AM CET Der legendäre kubanische Staatschef verzichtet laut Online Ausgabe der kommunistischen Parteizeitung a <mark>Fidel Castro zrezygnował!</mark> de en es fr it nl kleinezeitung 10. Przywódca kubański Fidel Castro po 49 latach rządów zrezygnował we wtorek z funkcj Fidel Castro går av de en es fr it nl Partiav Fidel Castro renuncia a la Presidencia del Consejo de Estado przewodniczącego Rady Państwa Kuby. Fidel Castro renunciou à presidência de Cuba de en es fr it nl et no pl pt ro sl sv tr stat ps VG A Cuba, Fidel Castro renonce au pouvoir de en es it nl ar bg da Anúncio no órgão oficial do Partido Comunista cubano Fidel Castro anunciou hoje qu Fidel Castro se retrage de la presedintia Cubei de en es fr it n Fidel Castro a anuntat, marti, ca renunta la presedintia Cubei, in editia electronica a cotidianulu Cuba, Fidel Castro rinuncia alla presidenza de en es fr nl ar Fidel Castro se je odpovedal položaju kubanskega predsednika de en es fr ru sl sv tr Kubanski voditelj Fidel Castro je danes sporočil, da se odpoveduje položaju predsednika države. Kot je L'A Cubaanse president Fidel Castro afgetreden de en es fr co ro ru sl sv tr ht Castro še zapisal v sporočilu, objavljenem v spletni izdaji uradnega glasila Granma, se ne poteguje ir Värmby skakade hand med Fidel Castro. de en es fr it nl – Ja. Jag har inte tvättat högernäven sedan dess, 1983. Jag var på en stor sammandragning på Kuba de en fr it nl كاسترو يستقيل ويوش يدعو للتحول الديمقراطي في كويا med uppmaningen att USA skulle häva blockaden mot landet. smp kl 19:51 CET ي في رواندا، إلى مساعدة كوبا على البدء بعملية "انتقال ديمقراطية"، وذلك إثر قرار الزعيم -- (CNN)هافانا، كوبا ستان مراقع و Обидель Кастро отказался от поста председателя Госсовета Кубы de en fr i Фидель Кастро отказался от поста председателя Госсовета Кубы de en fr i القال كاسترو، بالتنعي عن منصبه كرئيس البلاد. وقال بوش: "إن على المجتمع الدولي أن يعبل بع الشعب الكوبية المؤسلة المساكن Кастро се оттегли от президентския пост de en es fr it ГАВАНА, 19 февраля. /ИТАР-ТАСС/. Фидель Кастро отказался от поста главы государства и

# Cross-lingual Doc. Sim. Introduction

Bir dönemin sonu de en es fr it n

Üks 20. sajandi menukam vabadus-võitleja ja tuntum diktaator Fidel Clameliyattan beri iktidar koltuğundan uzak kaldı. Ülke yönetimine, ağabeyi Fidel Castro'ya vekalet eder kui Nõukogude "gerondid", kelle jaoks tähendas lahkumine võimult ka Raul Castro bakıyordu.
võim kestab vähemalt esiotsa edasi, sest esimeseks asendajaks peetal hurivetim 10:15:00 CET

- · How to find out whether two texts in different languages are related?
- Most common approach: use MT or bilingual dictionaries to translate into English, then use monolingual methods to calculate similarity.
  - Using MT (e.g. Leek et al. 1999, Pinto et al. 2009);
  - Using bilingual dictionaries (e.g. Wactlar 1999, Urizar & Loinaz 2007)
- Automatically produce bilingual word associations for bilingual document representation and document similarity calculation, e.g.
  - Bilingual Lexical Semantic Analysis (LSA)

(Landauer & Littman 1991)

Kernel Canonical Correlation Analysis (KCCA)

(Vinokourov et al. 2002)

правительства - председателя Государственного совета Кубы. Об этом он сообщил в обращении

Küba Komünist Partisi'nin yayın organı Granma'ya açıklama yapan Castro, devlet başkanlığına geri dönmeyeceğini belirtti. Fidel Castro 1959 yılından beri ülkeyi yönetiyordu. Ancak 2006'da geçirdiği ağır

- Place documents in reference to position in comparable text collections (e.g. Wikipedia)
  - Cross-lingual Explicit Semantic Analysis (CL-ESA) (Potthast et al. 2008)
- + Achieved results are relatively good

Фидел Кастро обяви, че се отказва от президентския пост, съобщава

Fogh vil ikke savne Castro de en es fr it nl

epl 23:17:00 CET

"Poli<mark>(REPLIIK: Castro-aja lõpu algus</mark> de en es fr it nl

- Bilingual approach is restricted to a few languages

Language pairs = N \* (N -1) / 2

(N = number of languages)

20 NewsExplorer languages → 190 language pairs (380 language pair directions)!

# Cross-lingual Doc. Sim.



# Our approach

- Alternative: use language-independent anchors:
  - · Names of persons and organisations
  - Names of locations
  - Units of measurements:
    - Time
    - Speed
    - Temperature
    - Acceleration
  - Multilingual specialist dictionaries (Eurovoc for public administration, MeSH for medicine, etc.)
  - ...
- Normalise these expressions
- →Use as kind of an interlingua; no language pair-specific resource needed
- Similarly: Gupta et al. (2012) use Eurovoc and named entities

Steinberger Ralf, Bruno Pouliquen & Camelia Ignat (2004). **Providing cross-lingual information access with knowledge-poor methods**. In: Andrej Brodnik, Matjaž Gams & Ian Munro (eds.): **Informatic**a. An international Journal of Computing and Informatics. Vol. 28-4, pp. 415-423. Special Issue 'Information Society in 2004'. ISSN: 0350-5596. The Slovene Society Informatika, Ljubljana, Slovenia.

Steinberger Ralf (2011). A survey of methods to ease the development of highly multilingual Text Mining applications. Language Resources and Evaluation Journal, Springer (DOI 10.1007/s10579-011-9165-9).

# **CL Document Similarity**



### Language-independent anchors

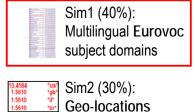
Libyan rebels continue westward push [67] de es fr nl ar bg da et fa no pl pt ro ru sl sv sw tr

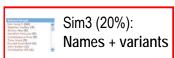
Language-independent features for multilingual document representation

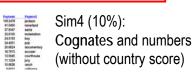
No MT or bilingual dictionaries

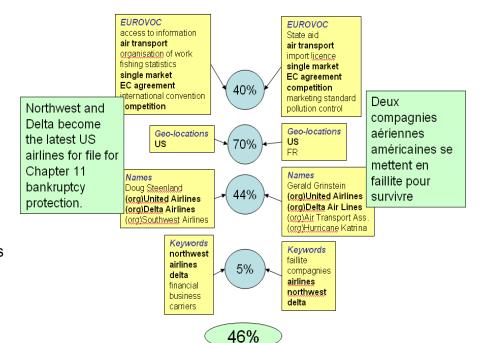
20 languages

CLDS =  $\alpha \cdot S1 + \beta \cdot S2 + \gamma \cdot S3 + \delta \cdot S4$ 









# **CL** document similarity



## **Evaluation**





- Task: evaluate manually the automatically proposed cross-lingual (CL) links
  - At various similarity threshold levels
  - ~25% of EN clusters had no cl links in FR and IT;
  - Only highest-scoring link was evaluated;
  - 30% threshold was finally chosen to ensure good Recall.

Similarity threshold	FR+	FR-	IT+	IT-	
15 - 19%	0	7	0	1	
20 - 29%	1	6	2	11	
30 - 39%	5	6	7	8	
40 - 49%	16	4	13	5	
50 - 59%	19	1	18	6	
60 - 100%	34	1	29	1	
Accuracy at 30% threshold	R=99%	P=86%	R=97%	P=69%	

- + Cluster was related
- Cluster was not (so) related

Pouliquen Bruno, Ralf Steinberger, Camelia Ignat, Emilia Käsper & Irina Temnikova (2004). **Multilingual and cross-lingual news topic tracking**. In: Proceedings of the 20<sup>th</sup> International Conference on Computational Linguistics (CoLing'2004), Vol. II, pages 959-965. Geneva, Switzerland, 23-27 August 2004.

# JRC EuroVoc Indexer JEX



# ML EuroVoc Indexing



Using the controlled vocabulary from EuroVoc (>6,000 classes)



- EuroVoc (http://eurovoc.europa.eu/)
  - is used for manual indexing by parliamentary libraries in EU
  - by parliamentary libraries in EU institutions and in many EU countries
  - Exists in 22 official EU languages plus Basque, Catalan, Croatian, Russian and Serbian
- JEX is freely downloadable from <a href="http://langtech.jrc.ec.europa.eu/Eurovoc.html">http://langtech.jrc.ec.europa.eu/Eurovoc.html</a>;
  - Readily trained for 22 languages
- · JEX includes software to re-train the system
  - · Training data is included in the release;
  - Allows you to run your own experiments and compare results / improve.
  - · You can train on your own data, using other thesauri.







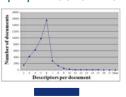
- Method: Profile-based category-ranking
  - E.g. Result for a document with the title:

    Legislative resolution embodying Parliament's opinion on the proposal for a Council Regulation amending Regulation No 2847/93 establishing a control system applicable to the common fisheries policy

 E.g. profile for the EuroVoc category FISHERY MANAGEMENT

<b>且</b> fishery_resource	54.4721542368385
<b>I</b> fishing	49.111563204862
∎fish	46.196436023147
<b>且</b> common_fishery_policy	44.6741845971235
<b>且</b> fishery	44.1911518447189
<b>I</b> fishing_activity	43.3777671334009
<b>且</b> fly_the_flag	42.8744724542378
<b>1</b> aquaculture	39.2749719215554
<b></b> conservation	38.3480454820621
<b>∄</b> vessel	37.911138722495
fishing_vessel	37.8343365844963
<b>i</b> catch	36.8503034704154
<b>I</b> fish_stock	34.5283935973103
fitans	04.000450500040

Evaluation: P, R, F1 at *rank* 6.



<u>Descriptor text</u>	<u>Cosine</u>	<u>Rank</u> <u>Cosine</u>
FISHING CONTROLS [G]	0.360	1
FISHING GROUNDS [nt]	0.308	2
COMMON FISHERIES POLICY [G]	0.280	3
FISHERY MANAGEMENT [nt]	0.279	4
FISHING REGULATIONS [G]	0.270	5
FISHING PERMIT [G]	0.261	6
CONSERVATION OF FISH STOCKS [S]	0.253	7
FISHING AREA [G]	0.252	8
CONSERVATION OF RESOURCES [S]	0.251	9
FISHERY RESOURCES	0.232	10
CATCH OF FISH	0.213	11
FISHERIES POLICY	0.203	12
FISHING LICENCE	0.181	13
FISHING FLEET	0.179	14
FISHING INDUSTRY	0.176	15
EUROPECHE	0.176	16

# **JEX** evaluation



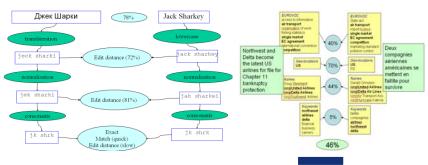
# for 22 languages

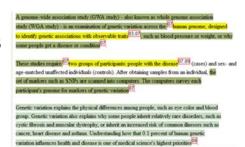
					_					
Language	Precision	Recall	F1	F1 dynamic rank	Categories / collection	Average categories trained	Stop words used (+MW)	Total number of documents	Document length (words) ± std-dev	All categories trained
BG	0.4619	0.5120	0.4857	0.4940	3780	2049.9	332	22696	786.96±2784.72	2147
CS	0.4689	0.5205	0.4933	0.4990	3691	2035.7	137	22830	890.66±3317.10	2129
DA	0.4747	0.5491	0.5092	0.5170	4226	2655	858	41727	561.87±1875.19	2752
DE	0.4732	0.5485	0.5081	0.5187	4230	2683.9	1793	41676	566.67±1945.44	2783
EL	0.4632	0.5369	0.4973	0.5118	4214	2486.4	105	41103	778.05±2379.45	2605
EN	0.4801	0.5547	0.5147	0.5227	4229	2324.1	1972 (+545)	41672	309.28±1176.39	2430
ES	0.4801	0.5545	0.5147	0.5188	4221	2297	481 (+264)	41397	547.63±1819.14	2406
ET	0.4828	0.5358	0.5079	0.5139	3662	2047.8	1533	21989	652.22±2193.32	2147
FI	0.4654	0.5341	0.4974	0.5081	4103	2528.8	92	38293	756.70±2565.81	2634
FR	0.4776	0.5536	0.5128	0.5227	4234	2588.7	1180	41989	663.33±2204.28	2688
HU	0.5121	0.5654	0.5374	0.5444	3585	1688.5	1228 (+709)	20838	551.66±1977.14	1788
IT	0.4713	0.5464	0.5061	0.5151	4234	2584.4	219	41838	764.57±2808.31	2688
LT	0.4920	0.5454	0.5174	0.5239	3635	1945.7	1199	21505	644.53±2724.18	2046
LV	0.4659	0.5175	0.4904	0.4968	3690	2011	14	22803	894.59±3012.39	2106
MT	0.4200	0.4545	0.4366	0.4416	3584	1762.3	6	17858	1016.99±2685.11	1864
NL	0.4803	0.5562	0.5155	0.5257	4232	2610.2	1414	41816	581.94±1819.66	2713
PL	0.4794	0.5311	0.5039	0.5077	3648	1967.1	125	22004	841.81±2795.35	2066
PT	0.4756	0.5493	0.5098	0.5237	4209	2560.6	1152	41142	700.46±2138.01	2663
RO	0.4550	0.5043	0.4784	0.4817	3887	2109.3	1504 (+48)	25023	994.17±3083.16	2206
SK	0.4705	0.5204	0.4942	0.4995	3645	1938.4	364	21406	872.53±3241.50	2050
SL	0.4840	0.5341	0.5078	0.5205	3685	2013.1	2068	22289	627.56±2669.38	2119
SV	0.4787	0.5473	0.5107	0.5194	4109	2546.4	1093	38198	609.82±2365.26	2649

# Agenda



- EC-Joint Research Centre (JRC) Who we are
- Monolingual plagiarism detection (PD) work at the JRC
- Cross-lingual similarity calculation at the JRC
  - Named entity (NE) matching across languages
  - Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
- Summary





#### Bashar Assad

Besher al-Assad, "..............." I Bacher al-Assad.
Beschar al-Assad, Esuap Acast,
Beschar al-Assad, Besup Acast,
Besper Esad, Bacher al-Assad, Besup Acast,
Besher al Assad, Besher al-Assad,
Bacher al Assad, Besher al-Assad,
Besher al Assad, Besher al-Assad,
Besher al Assad, Besher al-Assad,
Besher al-Assad, Besher al-Assad,
Beschar al-Assad,
Besher al-Assad, Besher al-Assad,
Beschar al-Assad,
Besher al-



Assad, Baschar el-Assad, Begir Esad, Bashir al Assad, Başer Esad, Bashar al-Assad, Bashir Al-Assad, Baschar Asad, Bashir al Assad, Begir Esad, Baszira Asada, Baschir Asad, Beshir Asad, Bashar E-Asad, Bashar al-Asad, Bashir el Asad, Bashar El-Asad, Baschar al-Assad, Baschar Bashar Esad, Baschar al-Asad, Bashar El-Asad, Bashar el-Asad, Baschar al-Assad, Baschar Bashar al Asad, Baschar al-Asad, Bashar El-Asad, Baschar al-Assad, Baschar al-Ass

# Translation spotting



# using EuroVoc indexing

Task: find Spanish translations of English source document in a parallel text collection

by calculating the cosine similarity between document's EuroVoc vectors.



Is the document's translation the most similar document in the other language?

	Search space	Without length factor	With length factor
Simple document similarity (DS)	820 Es	90.61%	96.83%
DS considering the length of documents	820 Es	00.12%	01.71%
Different text type	795 Es	84.28%	90.31%
Mixed-language search space	410 Es + 410 En	69.68%	81.91%
DS correcting mono-lingual bias (83%)	410 Es + 410 En	92.91%	96.82%

Precision at rank 1.

Pouliquen Bruno, Ralf Steinberger & Camelia Ignat (2003). Automatic Identification of Document Translations in Large Multilingual Document Collections. In: Proceedings of the International Conference Recent Advances in Natural Language Processing (RANLP'2003). Borovets, Bulgaria,

# Translation spotting



# Is there a translation?

· Setting a threshold, juggling Precision and Recall

_		=	Section 2	-	-
	1:5	_			
	1:3	-		1.00	
	1	_	The second second	200	
			The second second	- 1	
		- 1	Per su		
		_		- 111	
		- 1			
	T-rest		4	110	
		-	1900	100	
			The state of the s	- 100	
		-3			
		_			
		-		1.115	
	1335	-1		- 10	
-				- 4	

Test bed	Average similarity	Threshold	Recall	Noise (1-Precision)	
Set T1 (820)	0.82	0.70	90%	2.2%	
Set T2 (795)	0.79	0.70	76.5%	5%	

- Searching for a translation where there is none:
  - · Searching in T2 for documents of T1
  - → 4.15% noise
- Best threshold depends on:
  - Document set
  - · Requirement: high recall or high precision?

Pouliquen Bruno, Ralf Steinberger & Camelia Ignat (2003). Automatic Identification of Document Translations in Large Multilingual Document Collections. In: Proceedings of the International Conference Recent Advances in Natural Language Processing (RANLP'2003). Borovets, Bulgaria,

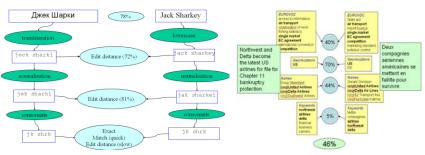
# Agenda







- Cross-lingual similarity calculation at the JRC
  - Named entity (NE) matching across languages
  - · Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
- Summary





A genome-wide association study (GWA study)—sho known as whole genome association intudy (WGA study)—is an examination of genetic variation across the <sup>10</sup> tourse precome, designed to dentify genetic associations with observable train <sup>10</sup> <sup>10</sup> such as blood pressure or weight, or only ionse people get a disease or condition.

These studies require <sup>10</sup> two groups of participants, people with the disease <sup>20</sup> <sup>20</sup> (cases) and sex- and age-matched unaffected individuals (controls). After obtaining samples from an individual, filling jet of markers such as SNPs are scanned into computers. The computers survey each participant's genome for markers of genetic variation.

Genetic variation explains the physical difference among people, such as eye color and blood group. Genetic variation also explains why some people inherit relatively rare disorders, such as cystic fibrosis and muscular dystrophy, or inherit an increased risk of common fibrases such as cancer, beart disease and authua. Understanding how that 0.1 percent of humans genetic variation influences health and disease is not of medical sciences is labert priorities.

[20]

#### Bashar Assad

Bashar al-Assad; Bashar



Jasahar Ari Asad, Gesar Asad, gast ar Asad, Gestioner et Besad, Bescher Arichsood, Beyle Erad (Bashir al Asad, Bayer Esad, Bashar al-Assad, Bescher Asad, Rasad, Bescher Asad, Basher al Asad, Beyer Essad, Bastira Asade, Beschir Asad, Bescher Asad, Bashar E-Radd, Bescher al-Asad, Bescher et Asad, Bescher Esad, Beger et Radd, Bescher Asad, Basr Asad, Bascher al-Asad, Bescher El Asad, Bescher et-Asad, Bescher al-Assad, Essand, Bascher Asad, Bascher al-Assad, Bescher al-Asad, Besche

# Freely available resources

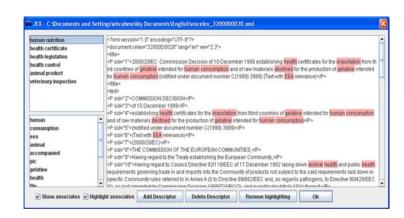


## **JRC Eurovoc Indexer JEX**



- Software to multi-label classify documents according to the multilingual Eurovoc thesaurus:
- 22 languages, thousands of categories;
- JEX uses machine learning;
- · Tool can be re-trained on users' documents, also for non-Eurovoc categories
- User interface and command-line options
- Tool is used for cross-lingual linking of news in EMM-NewsExplorer
- In use by the Spanish *Congress of Deputies* for interactive indexing since 2006.





# Freely available resources



## **JRC-Names**

# Name variant list and software to recognise names

- JRC-Names: a highly multilingual named entity resource (names and their many spelling variants, including across scripts):
  - Collected by analysing up to 150,000 news articles per day in up to 20 languages since 2004
  - Augmented with cross-script variants from Wikipedia, resulting in currently:
  - ~500K person and organisation names and their spelling variants
  - In 27 scripts and many more languages



אים (Mouammar Kadhafi; Muammar al-Gaddafi; Moammar Gadhafi; Muammar Gheddafi; Myamap Kaдaфи; Muammar Kadhafi; Muammar Gadhafi; Moamar Gaddafi; Moamar Gaddafi; Moamar Kadhafi; Muammar Gadhafi; Moammar Gadhafi; Muammar Khadafi; Muammar Khadafi; Muammar Khadafi; Muammar Gaddafi; Muammar Kaddafi; Muammar Kaddafi; Muammar Gadhafi; Muammar Gadhafi;

# Freely available resources



## Parallel corpora

Esm, Alta Corte: queste le condizioni rai-televideo 11.04.00 CEST

### Possible uses:

- · Train statistical machine translation software;
- Train multilingual vector space models (e.g. LSA or KCCA);
- Derive multilingual dictionaries;

• ...

## Data already available (22 languages each):

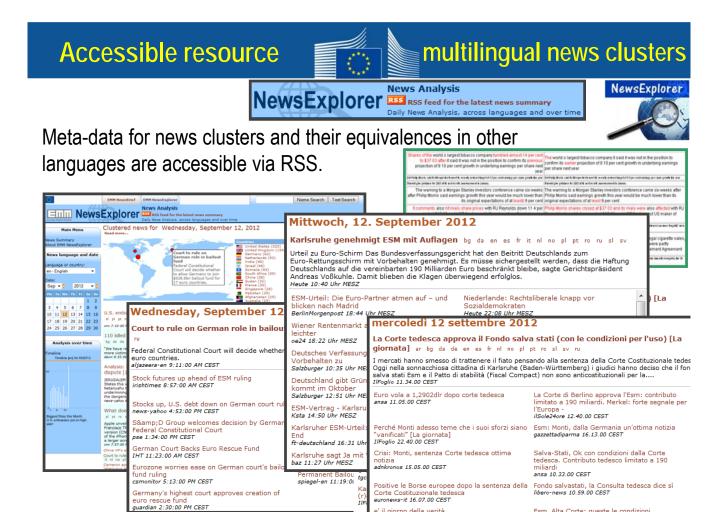
JRC-Acquis full-text parallel corpus (domain: mostly legal; agreements; contracts)

DGT-TM Translation Memory (domain: mostly legal)
 JEX data full-text parallel corpus (domain: legislation)

## Forthcoming (25, 25, 23 languages):

EAC-TM Translation Memory (domain: education and culture)
 ECDC-TM Translation Memory (domain: public health and medicine)
 DGT-Acquis full-text parallel corpus (domain: legal, administration and more)

•See: http://langtech.jrc.ec.europa.eu/JRC\_Resources.html



# **Summary**



- Monolingual plagiarism detection work at the JRC
  - N-gram overlap; varying search and visualisation methods
- Cross-lingual similarity calculation at the JRC
  - Named entity matching across languages
  - Linking related news items across languages
  - · Identifying translations of documents
- JRC's multilingual tools and resources
  - JRC-Names multilingual name variant lists
  - JEX EuroVoc subject domain classification
  - Parallel corpora: JRC-Acquis and various translation memories
  - · Cross-lingual linking of news clusters in NewsExplorer











