#### How AI Cured Coronavirus and Delivered UNIVERSAL TRANSLATION, and Other MT MYTHS AND MAGIC



18 November 2020 Translating and the Computer ASLING TC42 online *Keynote Address* 



kamusi is Swahili for *dictionary* 



Goal: A complete matrix of human expression across time and space

- As a knowledge resource
- As a data resource
- As a basis for any-to-any translation





In service since 1994 - originally at **Yale Council on African Studies** International NGO since 2009

Registered non-profit in and Academic Home since 2013:
 EPFL - Swiss Federal Institute of Technology in Lausanne
 First at LSIR - Distributed Systems Information Laboratory
 Now at the Swiss EdTech Collider







# **kamusi.org** White House Big Data Initiative (2013):

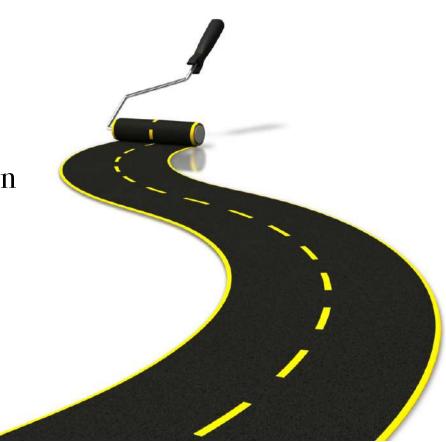
Launch Partner for Building the Data Innovation Ecosystem Networking and Information Technology R&D Program Office of Science and Technology Policy



ACALAN (Intergovernmental language agency for 55 member states of the African Union): Platform for African Language Empowerment development partner

Artificial Intelligence (AI) & Machine Translation (MT) on the Road toward Universal Translation

- 1. AI facts and fantasies
- 2. Myths about AI and MT
- 3. Realistic fantasies about computation and translation





### Chapter 1: AI Facts and Fantasies

- 1. What is AI?
- 2. AI and COVID-19
- 3. AI and the weather
- 4. AI and online dating
- 5. AI and language



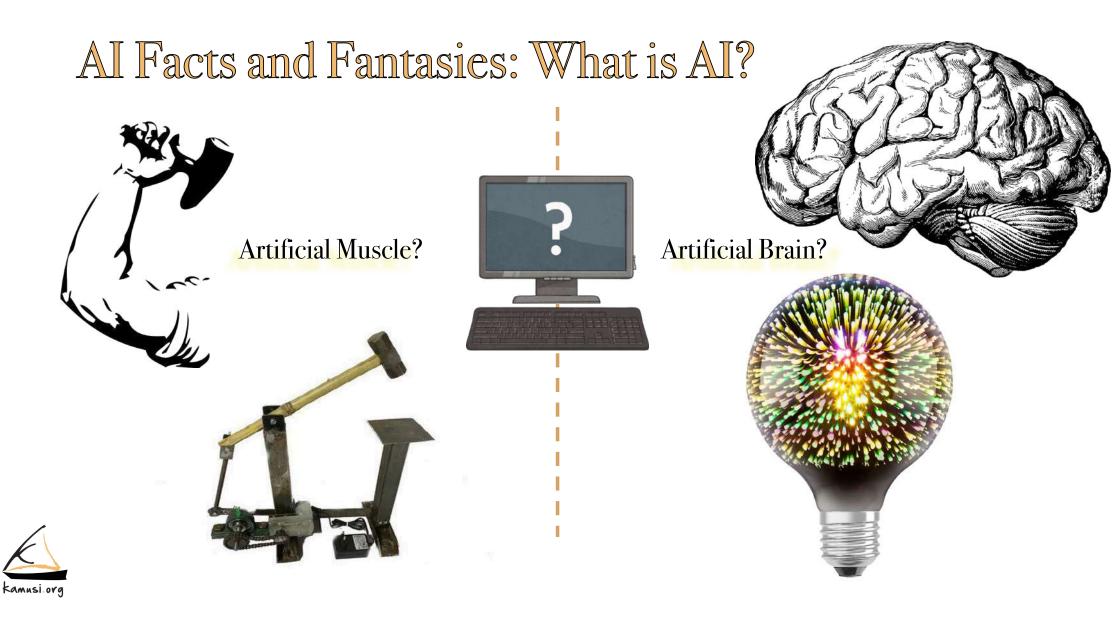


### AI Facts and Fantasies: What is Artificial Intelligence?

- 1. What is AI?
- 2. AI and COVID-19
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### AI Facts and Fantasies: What is Artificial Intelligence?



### Artificial Muscle

- Brute force calculations
- Faster than a human
- Instructed by a human

#### Example:

#### Calculate $oldsymbol{\pi}$ to a million

 digits
 3.14159265358979323846264338327950288419716939937510582097494459

 230781640628620899862803482534211706798214808651328230664709384

 460955058223172535940812848111745028410270193852110555964462294

 895493038196442881097566593344612847564823378678316527120190914

 564856692346034861045432664821339360726024914127372458700660631

 558817488152092096282925409171536436789259036001133053054882046

 652138414695194151160943305727036575959195309218611738193261179

 310511854807446237996274956735188575272489122793818301194912983

 367336244065664308602139494639522473719070217986094370277053921

 717629317675238467481846766940513200056812714526356082778577134

 275778960917363717872146844090122495343014654958537105079227968

 925892354201995611212902196086403441815981362977477130996051870

 72113499999837297804995105973173281609631859502445945534690830

 26425223082533446850352619311881710100031378387528865873320838

 142061717760914730359825349042875546873115956286388235378759375



#### Artificial Brain

- Analyzes data
- Discovers patterns
- Follows new paths based on those patterns





- a desired outcome is achieved (eg, win a game) -- or --
- a human confirms the outcome (eg, that photo is indeed a cat)



### AI Facts and Fantasies: What is AI?

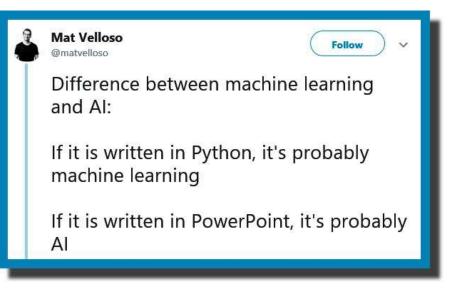


The New York Times

A Step Forward in the Promise of

Unlike trains, which run on fixed schedules, hyperloop pods would function more like smart elevators. Artificial intelligence would adjust destinations, the number of pods that travel in a convoy and departure times based on demand.







### AI Facts and Fantasies: COVID-19

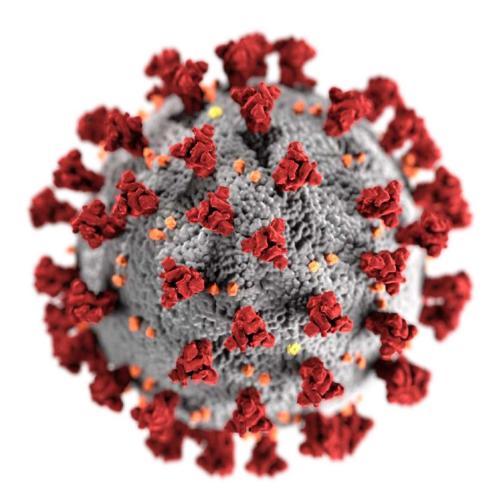
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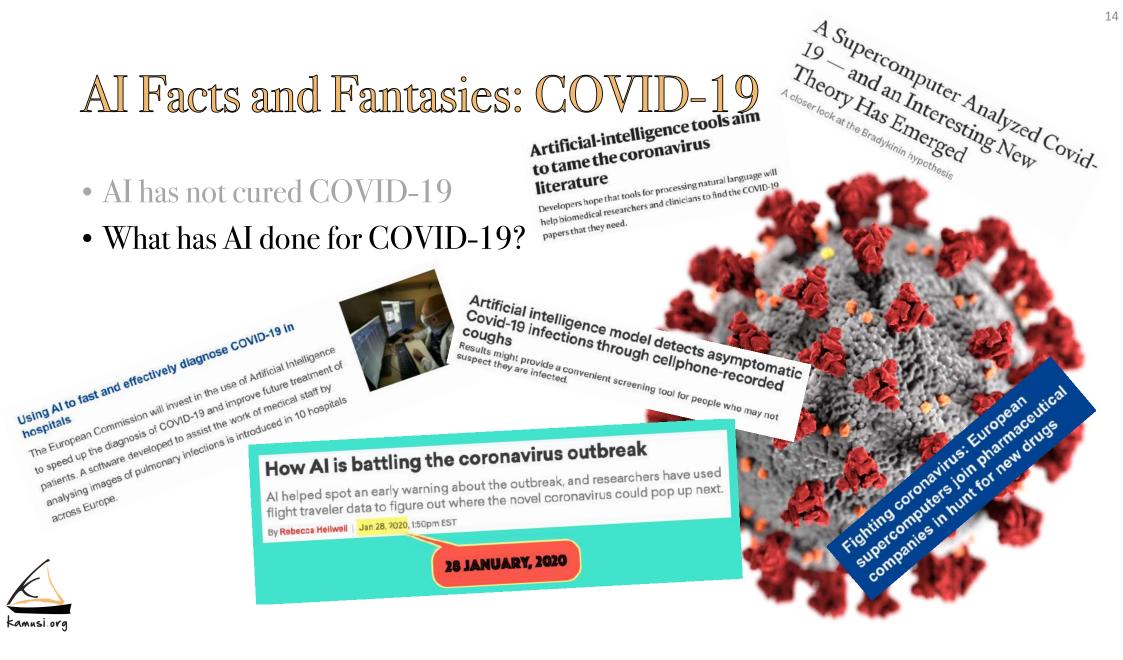


### AI Facts and Fantasies: COVID-19

- **SPOILER:** AI has not cured COVID-19
- What has AI done for COVID-19?







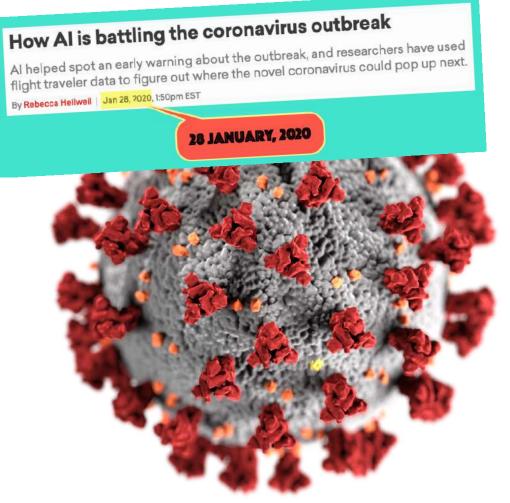
### AI Facts and Fantasies: COVID-19

- AI has not cured COVID-19
- What has AI done for COVID-19?

"In other words, our new AI overlords might actually help us survive the next plague."

- Using NLP to track 100,000 articles about 100 diseases in 65 languages
- Travel itineraries and flight paths
- Researching new drugs
- Detecting disease

Vox: https://www.vox.com/recode/2020/1/28/21110902/artificial-intelligence-ai-coronavirus-wuhan



### AI Facts and Fantasies: The Weather

- 1. What is AI?
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- 5. AI and language





### AI Facts and Fantasies: The Weather

Data to analyze for many locations:

- Temperature Humidity Pressure Windspeed Wind direction
- Cloud cover etc

Patterns to discover:

- Does the flap of a butterfly's wings in Brazil set off a tornado in Texas? (Edward Lorenz)
- The relationship between certain parameters in Place A, and subsequent weather in Place B

New Paths:

• If certain parameters are changed in a model for Place A, what are the anticipated outcomes in Place B?

Machine Learning:

• Do future weather events occur as anticipated in the model?

- Analyzes data
- Discovers patterns



Follows new paths based on those patterns

#### Machine Learning if

• a desired outcome is achieved (eg, win a game)

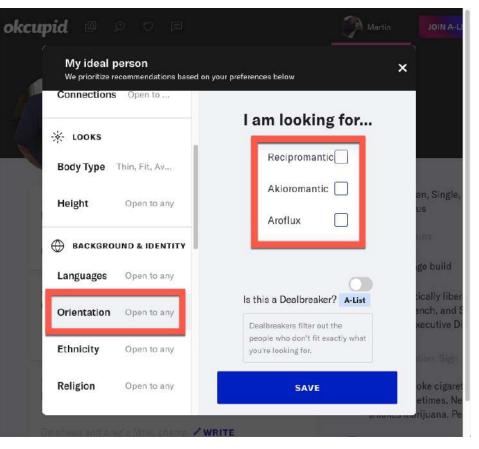


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#### Case Study: OkCupid



- Analyzes data
- Discovers patterns
- Follows new paths based on those patterns

19

#### Machine Learning if

• a desired outcome is achieved (eg, win a game)



#### Case Study: OkCupid

Preferences	Ø Settings
IQupid NEWD	
Tips & Insights to level-up your online dating IQ ANSWER MORE QUESTIONS	HIGHEST POSSIBLE MATCH
Question Pro Prodigy Genius 30 100 500 + 408 Tip: Answer more questions to increase	99.8% Your highest possible match based on the questions you have answered.
compatibility.	MORE QUESTIONS
	a day of binge-watching?
SKIP	ANSWER

- Analyzes data
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#### Machine Learning if

• a desired outcome is achieved (eg, win a game)



#### Case Study: OkCupid

Your answer

I have 1 or more big tattoos I have 1 or more little tattoos

I have 1 or more big tattoos I have 1 or more little tattoos

I have no tattoos

Answers you'll accept

I have no tattoos

Do you like coffee?	
Your answer	
Yes. I need it to function.	۲
Yes, but I can do without it.	
No.	
Answers you'll accept	
Yes. I need it to function.	~
Yes, but I can do without it.	~
No.	~

	Your answer	
	Yes	۲
	No	
	Answers you'll accept	
	Yes	
	No	
Do you have any t	attoos?	

0

Do you have a child or children?

- Analyzes data
- **Discovers patterns** 
  - Follows new paths based on those **patterns**

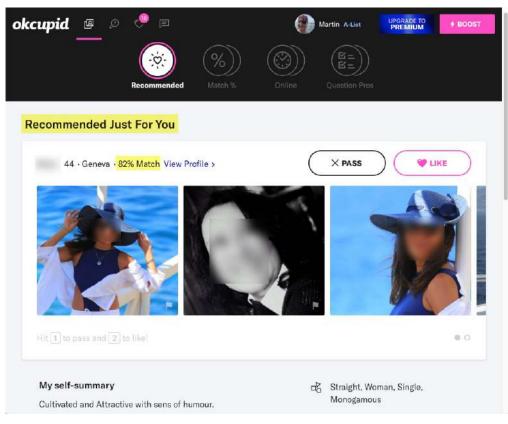
#### Machine Learning if

a desired outcome is achieved (eg, win a game)

Which word describes yo	u better?
	You 🥠
Carefree	0
Intense	0



#### Case Study: OkCupid



- Analyzes data
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#### Machine Learning if

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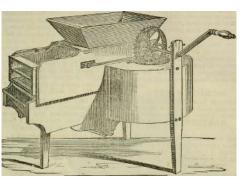


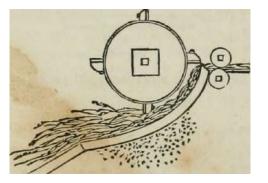
#### Case Study: OkCupid





- Arbitrary metrics questions have equal weight, but unequal (and unmeasurable) significance. (Eg, "Is pizza a top 5 food?" = "Would
  - you date a single parent?") Ambiguity
- Is it more important to you that you are tactful, or truthful? Ambiguity
- Machine is discovering equal answers, not patterns AI would analyze the similarities among people one "likes" to find unseen preferences
- All data, no chemistry and no way to predict or evaluate chemistry No outcome for a machine learning opportunity is either proposed or evaluated: • mutual "likes? • a chat? • a date? • a relationship?
- marriage? kids?





- Analyzes data
- Discovers patterns
- Follows new paths based on those
   patterns

#### Machine Learning if

• a desired outcome is achieved (eg, win a game)

Your answer	Algorithm Fail:
	Algorith, person A
Giving massages	Algorithm Fail: For compatibility, Person A and Person B should have
0	and Person D answers
Receiving massages	inverse uit

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#### Case Study: DeepL

	Into Fra	ench 🗸 Form		
ranslate from English (detected) 🗸		ench 👻 Formi	al/informal 🗸 💽	Glossa
The restrooms were out of order.	× Les	toilettes <mark>étaier</mark>	nt hors d'usage.	
	>			
	Ì			
	32 / 5000			

- Analyzes data
- Discovers patterns



Follows new paths based on those patterns

- a desired outcome is achieved (eg, win a game)
- -- or --
- a human confirms the outcome (eg, that photo is indeed a cat)



#### Case Study: DeepL

ranslate from English (detected) 🗸	Into I	French 💙 Formal/inform	al 🗸 💽 Gloss
The restroom was out of order.	×Le	s toilettes <mark>étaient hor</mark>	s service.
		Toi	lettes s service
	()		$\nearrow$
		NE PA	AS UTILISER
	30 / 5000		

- Analyzes data
- Discovers patterns



Follows new paths based on those patterns

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#### Case Study: DeepL

ranslate from English (detected) 🗸 🗸	Ir	nto French 🗸 🛛 Formal/in	formal 🗸 💽 Glossa
The files were out of order.	×	Les dossiers <mark>étaient</mark>	hors d'usage.
	2		
	C		
		Alternatives:	
		Les dossiers <mark>étaient en p</mark>	panne.
		Les dossiers <mark>étaient en j</mark>	panne.
	28 / 5000	Les dossiers <mark>étaient en j</mark>	panne.

- Analyzes data
- Discovers patterns



Follows new paths based on those patterns

- a desired outcome is achieved (eg, win a game)
- -- or ---
- a human confirms the outcome (eg, that photo is indeed a cat)



#### Case Study: DeepL

anslate from English (detected) V	Into French V Formal/informal V ON Glossa
Inexplicably incorrect tense	Correct vocabulary: legal documents feature highly in DeepL training data (test this sentence on linguee.com)
	Alternatives: Cette motion est irrecevable.

- Analyzes data
- Discovers patterns



Follows new paths based on those patterns

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#### Case Study: DeepL

ranslate from English (detected) 🗸 🗸	Into	French 🗸 For	mal/informal 🗸		lossa
The lawyers <mark>were out of order.</mark>	×	es avocats <mark>éta</mark>	aient hors sen	<mark>/ice.</mark>	
	30 / 5000				
Translate document		Insert	C	ору	

- Analyzes data
- Discovers patterns



Follows new paths based on those patterns

- a desired outcome is achieved (eg, win a game)
- -- or ---
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#### Case Study: DeepL

Franslate from English (detected) 🗸	Into French 🗸 🛛 Forn	nal/informal 🗸 💽 Gloss
Turblace from English (detected)		
The lawyers were out of order.	Les avocats <mark>éta</mark>	ient hors service.
		en panne
		en désordre
		dans I
		mal
		indisciplinés
	3	défaillants
	9	dérangés
		en dehors
		débordés
30 / 500	)	
Translate document	Insert	Сору

- Analyzes data
- Discovers patterns

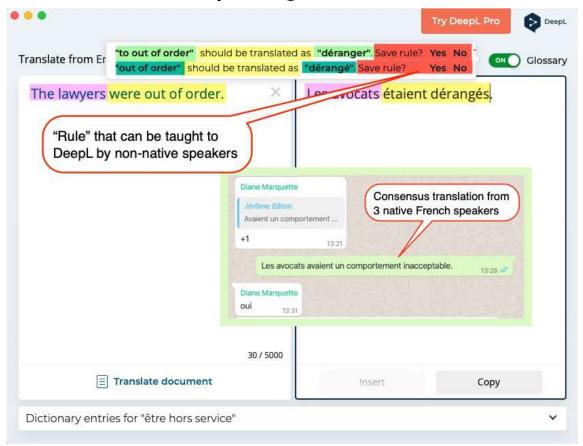


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### Artificial Intelligence (AI) & Machine Translation (MT) on the Road toward Universal Translation

- 1. AI facts and fantasies
- 2. Myths about AI and MT
- 3. Realistic fantasies about computation and translation





### Chapter 2: Myths about AI and MT

- 1. We have the data
- 2. We have the methods
- 3. Other biases and blind spots





### Myths about AI and MT

- 1. We have the data
- 2. We have the methods
- 3. Other biases and blind spots





### Myths about AI and MT: We have the data

## Data

### **Words** that have been **digitized** in a way that can be used within computer processes

- English
- Other high-investment languages
- Other high-population languages
- The other 98% of languages



- 70 years of R & D
- All English words have some digital existence
- Many data sets include party terms (aka "multiword expressions")
- Natural Language Processing (NLP) can perform many analytical marvels (deduce parts of speech, verb conjugations, compose syntactically correct sentences...)
- Meaning and Shape are poorly associated (stay tuned!)
- We cannot interpret the data across systems (interoperability)
- We do not have reliable translations of English terms to most other languages (polysemy, party terms)
- Translation to and from English is only a small part of global translation needs

• English

- Wards that have been digitized in a way that can be used within computer processes
- Other high-investment languages
- Other high-population languages
- The other 98% of languages



The constant noise drove me up the wall • Google: Le bruit constant m'a fait monter le mur. • DeepL: Le bruit constant m'a fait grimper le mur. • Bing: Le bruit constant m'a conduit jusqu'au mur. • Systran: Le bruit constant m'a poussé vers le haut du mur. • WordReference.com:





- Major European languages (especially French, Italian, German, Spanish, Portuguese, Russian)
- Arabic, Chinese, Korean, and Japanese
- Tax money at work, e.g. Catalan, Estonian
- A few dozen somewhere on this part of the gradient
- Many words have some monolingual digital existence
- Some data sets with some party terms
- NLP inferior to English (claim based on analysis of which languages get research attention in computational linguistics)
- Parallel corpora with English
- Little data between non-English pairs
- We cannot interpret the data across systems (interoperability)
- MT is computed through spelling or word embeddings, disassociated from meaning

- English
- Other high-investment languages
- Other high-population languages
- The other 98% of languages

⊞	Ev File	aluation Score Edit View in				-	
ē	57.	. 100% . 💿	View only +				
	26.25						
	A	в	C.	D	E	Æ	0
16	Spanis	h was evaluated se	parately for SF	ain and Latir	America, P	ortugues	e was e
17							
18	1	Alphabetical	Bard	Tarzan	Fail		
19	1	Afrikaans	67.5	87.5	12.5		1
20		Albanian	26.25	40	60		3
21	3	Amharic	30	40	60		2
22	4	Arabic	32.5	40	60		3
23	5	Armenian	25	40	60		
24	6	Azerbaijani	37.5	55	45		1
25	7	Basque	37.5	47.5	52.5		1
26	8	Belarusian	40	55	45		5
27	9	Bengali	0	0	100		(
28	10	Bosnian	30	40	60		(
29		Bulgarian	40	60	40		6
30		Catalan	37.5	60	40		6
31	13	Cebuano	12.5	20	80		6
32	-	Chichewa	17.5	30	70		3
33	15	Chinese	55	65	35		3
34	16	Corsican	22.5	35	65		1



Words that have

been digitized in a way that can be used within computer

processes

- 9-figure languages, e.g. Hindi, Bengali, Indonesian, Swahili
- Fast growing languages throughout Africa and Asia
- 300+ embattled languages with more than 1,000,000 speakers
- Some words with some monolingual digital existence (e.g. brick-of-text dictionaries with some thousands of terms)
- Some basic bilingual dictionaries (lemmatic forms only), usually to English or French
- No NLP for most
- Some monolingual corpora higher on the gradient
- Zero interoperability
- MT to English exists for a few dozen, but is unusable

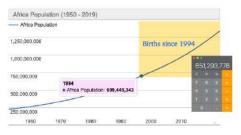
angazi, -a ~ brown kahawia isioiva, hafifu. 2 (of a place) -enve mwanga.~ coloured adj enye rangi isiyoiva. n 1 nuru, mwanga the ~ begins to fail mwanga unaanza kufifia day ~ mchana. in a good/bad ~ (of picture etc) -a kuonekana vizuri/vibaya; (fig) eleweka vizuri/vibaya. see the ~ (liter or rhet) zaliwa; baini; tangazwa; tambua; -okoka. be/stand in one's ~ kinga nuru; (fig) zuia mtu mafanikio/maendeleo vake. stand in one's own ~ zuia kazi yako isionekane; fanya kinyume na matakwa yako. ~ year n (astron) kipimo cha umbali kati ya nyota. 2 taa. ~s out muda wa kuzima taa. the northern/southern ~s n miali ya mwanga katika ncha za kaskazini na kusini. 3 mwako wa moto; kiberiti strike a ~ washa moto; washa kiberiti. 4 uchangamfu (usoni mwa mtu). the ~ of somebody's countenance (biblical) kupendezwa kwake. 5

light<sup>1</sup> adj 1 (of colour) -siokoza, -sioiva

• English

- Words that have been digitized in a way that can be used within computer processes
- Other high-investment languages
- Other high-population languages
- The other 98% of languages

#### Africa Population - 20 Oct, 2020 1,350,739,119



### 650 million new speakers of African languages in past quarter century

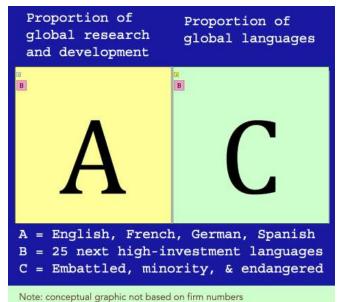
Source: https://www.worldometers.info/world-population/africa-population



- Almost 7,000 languages (exact number discussed at http://kamu.si/7000-languages)
- Negligible digital existence of any sort of data for most languages
- No data = not possible in universe of "Universal Translation"
- Included in the universe of "Universal Translation" hype
- Important to document, preserve, and offer certain technological services e.g., high quality dictionaries, language models
- Lesser call for text-to-text MT low (if any) literacy, few (if any) texts
- Speech-to-speech translation could be valuable, is technologically possible (needs 7000 graduate students to collect and make sense of data)

English

- Words that have been digitized in a way that can be used within computer processes
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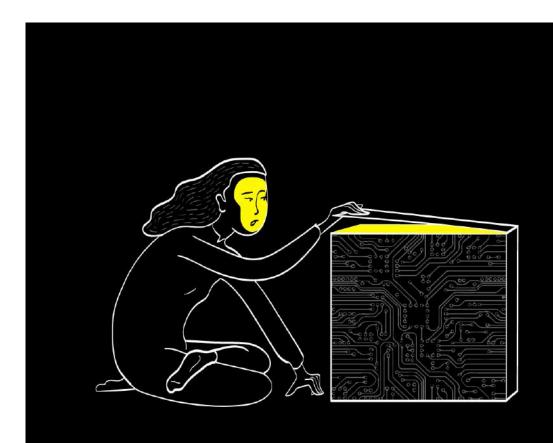
# Myths about AI and MT

- 1. We have the data
- 2. We have the methods
- 3. Other biases and blind spots





- Statistics (SMT)
- Corpora
- Neural Networks (NMT)
- Zero Shot
- Learning





- SMT is still a part of MT services (e.g., NMT can make no intelligent guesses about polysemy without context)
- Needs parallel data
- How SMT guesses (cartoon version)
  - "spring" = "primavera" in 40% of parallel sentences
  - other 60% "spring" = 10% bounciness, 10% a metal coil, 10% water flowing from the ground, 10% elastic force, 10% stretchiness, 10% a jump
  - Chance that SMT picks "springtime" sense = near 100%

### • Statistics (SMT)

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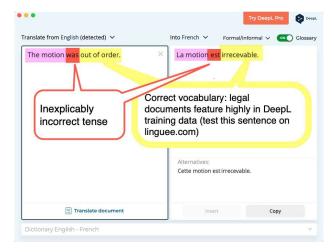




- Monolingual corpora can yield words, inflections, and expressions in one language
- Parallel corpora (translation gold) = extremely few pairs
- Limited topics formal documents in the public domain

kamusi.ora

 Daily speech generally out of scope (including secondperson constructions necessary for correspondence and text conversations)

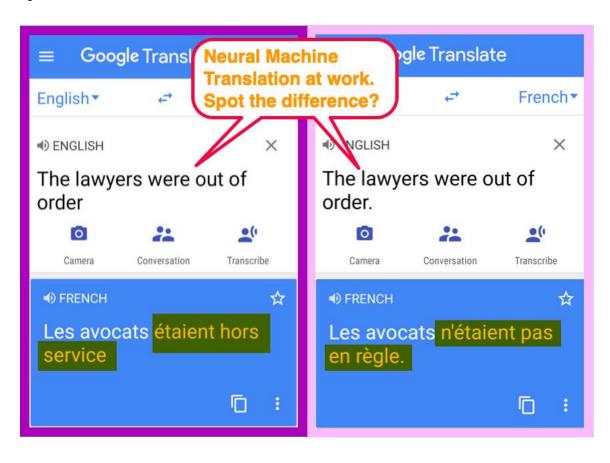


• Statistics (SMT)

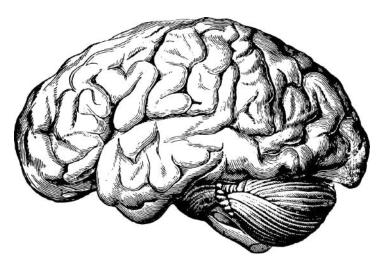
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#### • Learning





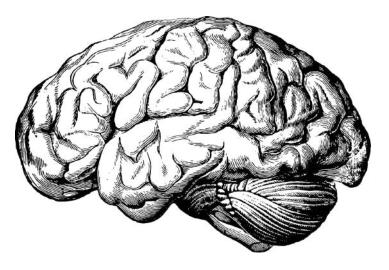
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- There is no brain. There are no neurons. "Neural network" is a marketing metaphor.
- NMT runs a lot of tests, can find hidden patterns
- With lots of parallel data, NMT performs nicely in certain circumstances:
  - I. The language is at the upper tier of testing on teachyoubackwards.com
  - 2. The conversion is to or from English
  - 3. The text is well structured and written using formal language and short sentences
  - 4. The text relater to formal topics
  - 5. The translation is for casual purposes where misunderstanding cannot result in unpleasant consequences
- Even with lots of parallel data, lots of misses (e.g., our "out of order" examples, with context words, missed 4 out of 5 times)
- MUSA: The Make Up Stuff Algorithm
- Much more: <u>http://kamu.si/myth2</u>
- Most language pairs do not have parallel data, so...

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#### • MUSA: The Make Up Stuff Algorithm

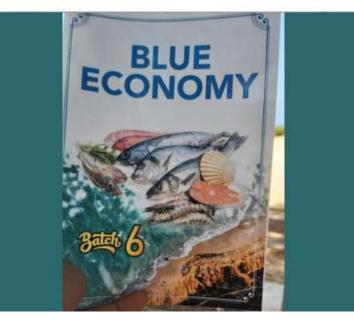
(Facebook MT) Real Somali  $\Rightarrow$ Fake English  $\Rightarrow$ 

	17
-	17 mins - 6

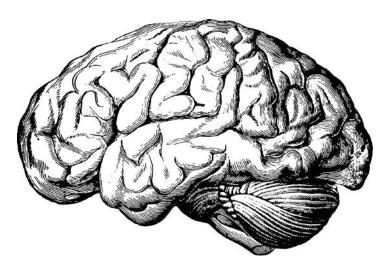
Berbera iyo qalinjabin kale. Dufcaddii lixaad ee Akaadamiga Culuunta Badda iyo <mark>Kalluunka. Hambalyo.</mark>

Berbera and another graduation. The sixth batch of the Adam of the Sea and the Fish. Congratulations to you.

• Hide original - Rate this translation



- Statistics (SMT)
- Corpora
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has never seel

#### • The idea:

- Align data from Language A with English.
- Google's Al can translate language 1 Align data from Language B with English. 2.
- 3 Shake.
- Remove English. 4.
- A to B Translation! 5.

- Results (technically): phenomenally bad
- Results (media): phenomenally good
- Results (public perception): phenomenally good
- Much more: <u>http://kamu.si/myth3</u>

- Statistics (SMT)
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- Machine Learning
  - Needs a "gold standard" to compare results against a "ground truth"
  - else -
  - Needs human validation of results
  - else Garbage In, Garbage Out
  - Only finds patterns within existing data
  - Risks locking info that is *sometimes* right as *always* right
- Learning from Users
  - 4 year "suggest an edit" experiment on Google Translate finds maximum 40% uptake
  - Crowdsourcing must be carefully fortified against bogus results not the case for Google "Translate Community DeepL "Rules"
  - Companies pay employees to teach AI for self-driving cars (so nobody dies), but not for most languages. That's a business choice, not science.
  - More: <u>http://kamu.si/myth5</u>



- Statistics (SMT)
- Corpora
- Neural Networks (NMT)
- Zero Shot
- Learning



# Myths about AI and MT

- 1. We have the data
- 2. We have the methods
- 3. Other biases and blind spots



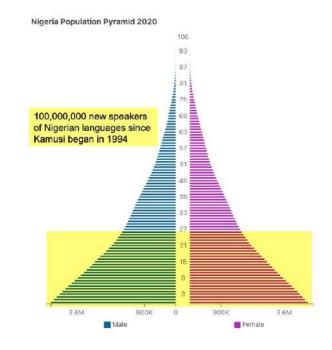


# Myths about AI and MT: Biases and blind spots

- Follow the money
  - Corporate investment
  - Government support
  - Foundation grants
- Follow the research
- English  $\neq$  Translation. Less important than people immersed in it think it is
- Elite language bias shared by leaders in Africa, India, etc
- Large tech-excluded languages are "Embattled" but not "Endangered" growing, not going, with unserved language needs and untapped market potential
- Yes, language technology is inequitable. Yes, it matters.



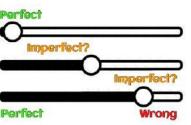
- White languages matter
- Technology works
- Computer knows best





# Myths about AI and MT: Biases and blind spots

- We tend to trust technology to do what it claims
  - Maybe your GPS takes you down a cow path today, but you'll certainly follow it again tomorrow
  - Search for "gorilla", you'll get mostly gorillas
  - Would Google put Samoan in their service if it didn't work? How's your Samoan?
- It isn't perfect, but...



- Willing suspension of disbelief
- Rooting for "Team Translate" we like tech victories, forgive (and forget) the defeats

- White languages matter (+CKJ)
- Technology works
- Computer knows best



"wild turkey" results in Google Images (top) "turkish wilderness" result in Flickr (bottom)



# Myths about AI and MT: Biases and blind spots

- Don't mind the gaps we fill in holes with our own understanding (fix tenses, odd words...)
- Confirmation bias we can see that some of the translation is correct, so the rest must be okay
- Magic wand results change as we type, so serious optimal calculations must be occurring. See "magic" in action: <u>http://kamu.si/myth4</u>
- Gaslighting it looks suspicious, but who am I to challenge the engineers and linguists who are telling me it's right?



- White languages matter (+CKJ)
- Technology works
- Computer knows best



## Artificial Intelligence (AI) & Machine Translation (MT) on the Road toward Universal Translation

- 1. AI facts and fantasies
- 2. Myths about AI and MT
- 3. Realistic fantasies about computation and translation





## Chapter 3: Realistic Fantasies about Computation and Translation

- Smurfs and Ducks
- Kam4D
- SlowBrew



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### Realistic Fantasies about Computation and Translation

- Smurfs and Ducks
- Kam4D
- SlowBrew





### Realistic Fantasies about Computation and Translation

SMURF = Spelling/ Meaning Unit Reference



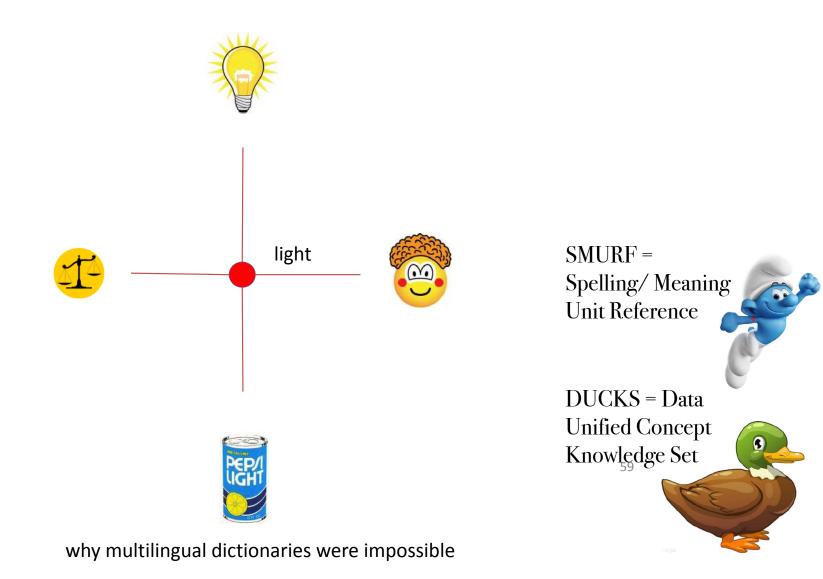
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DUCKS = Data Unified Concept Knowledge Set

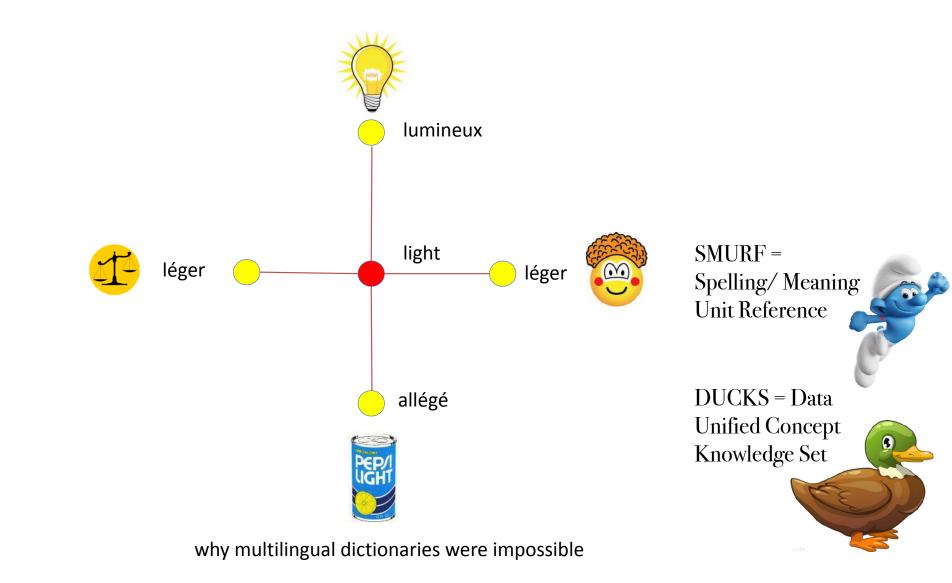




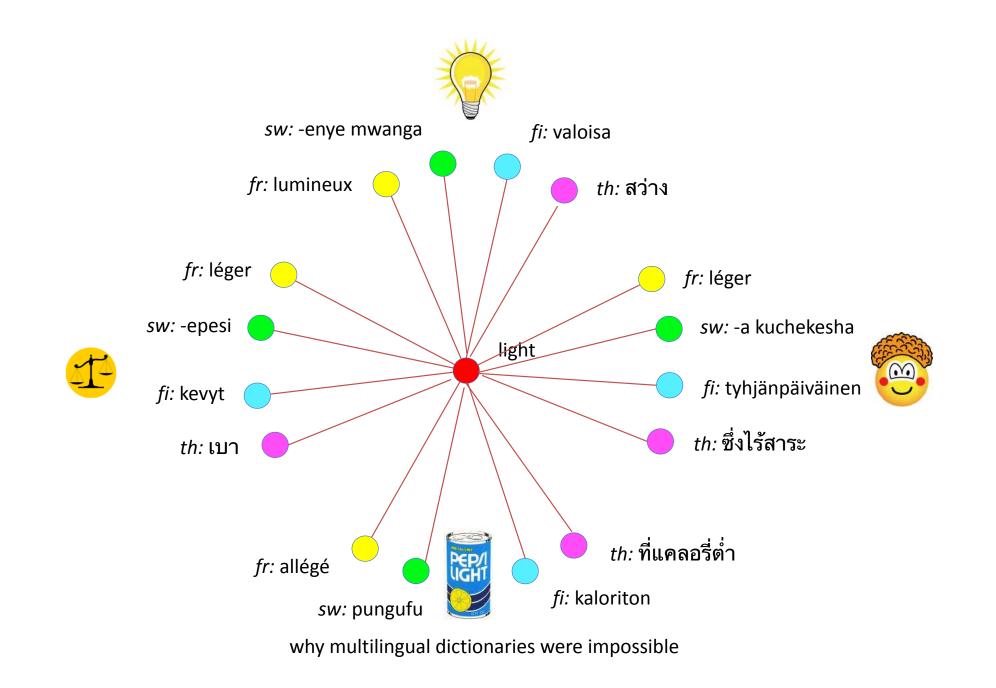


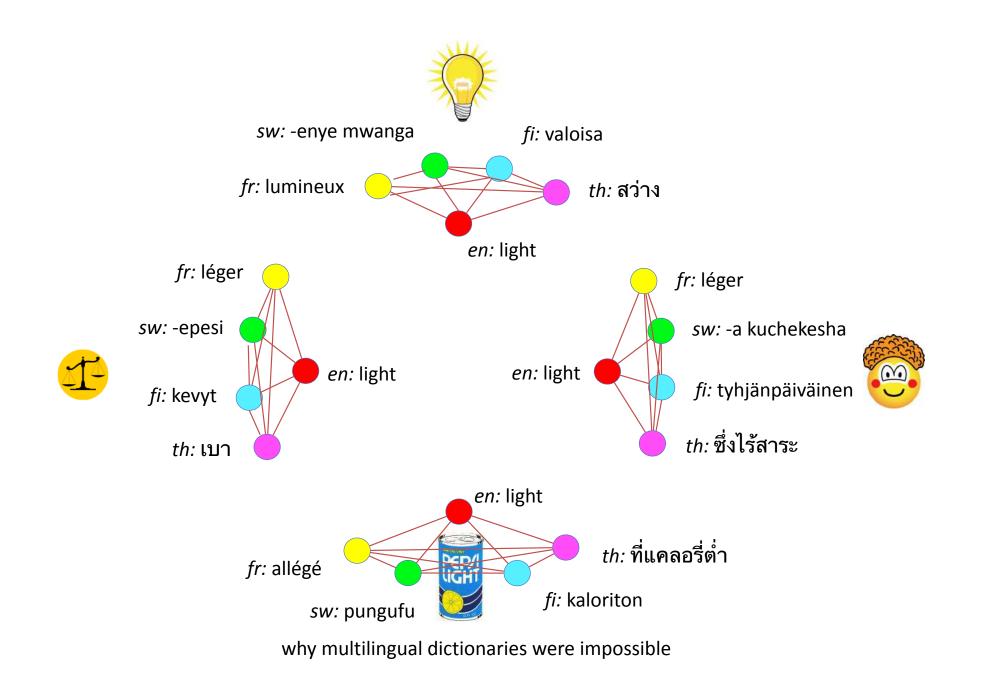


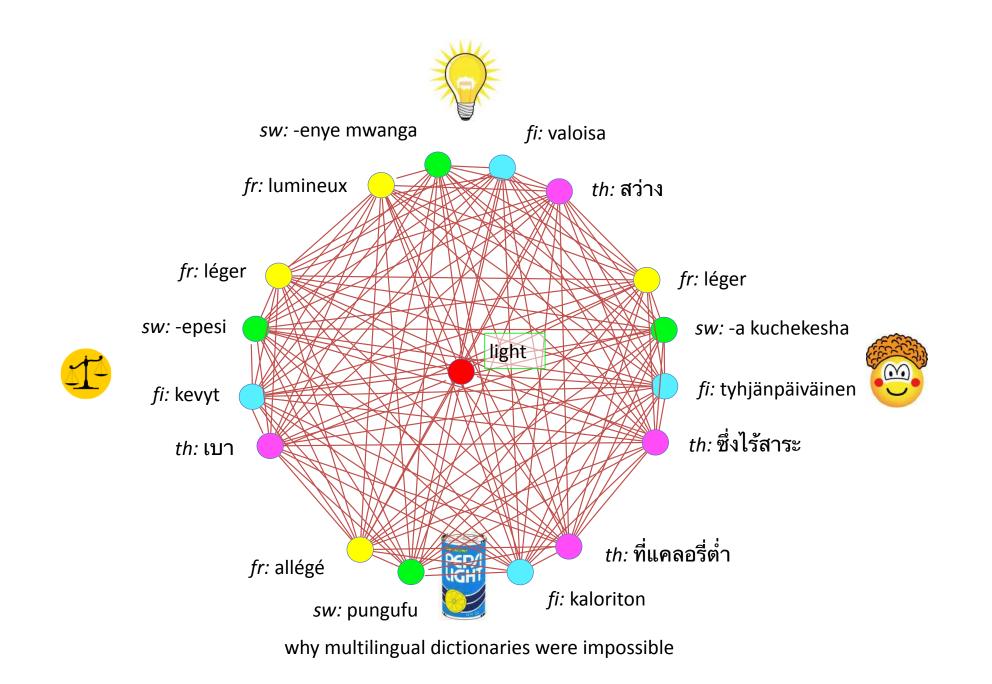




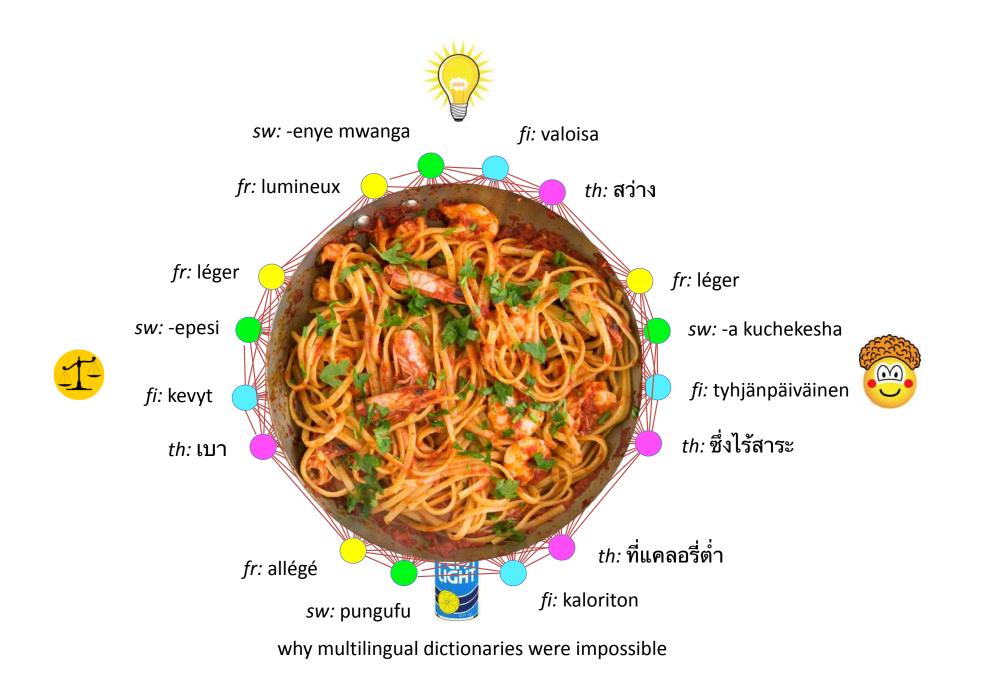








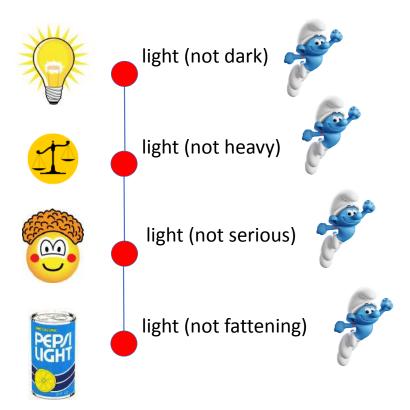
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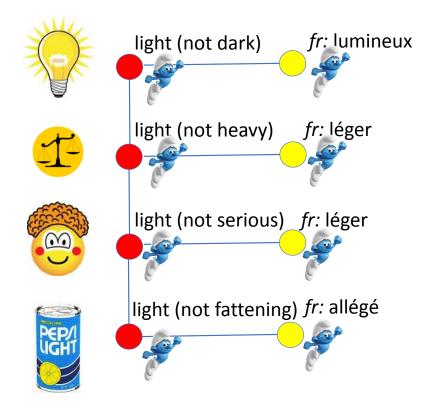
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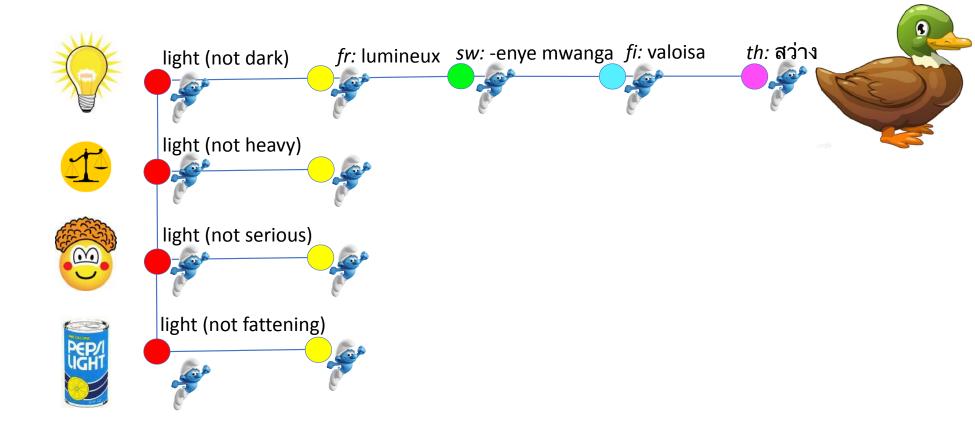




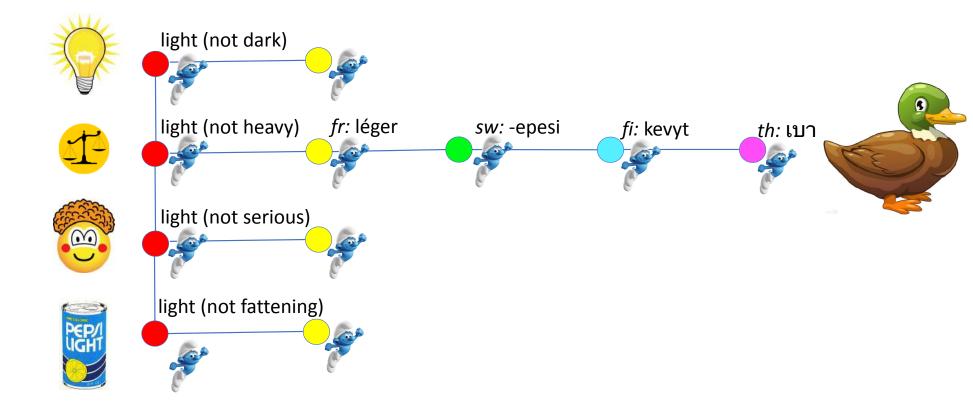




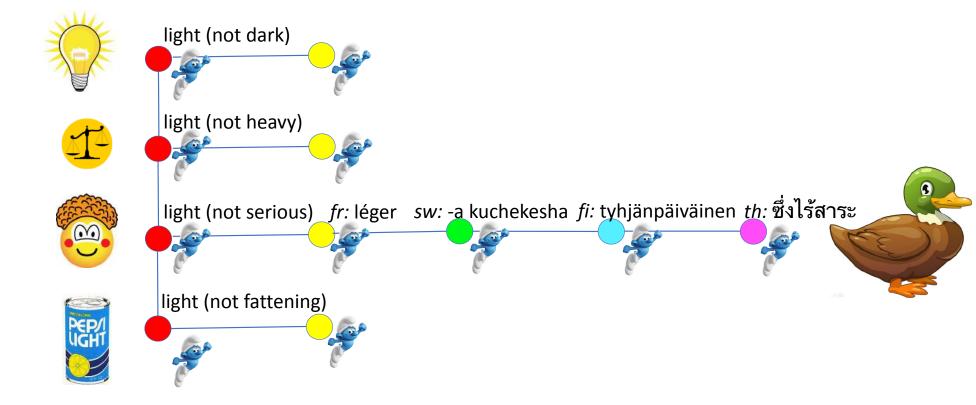
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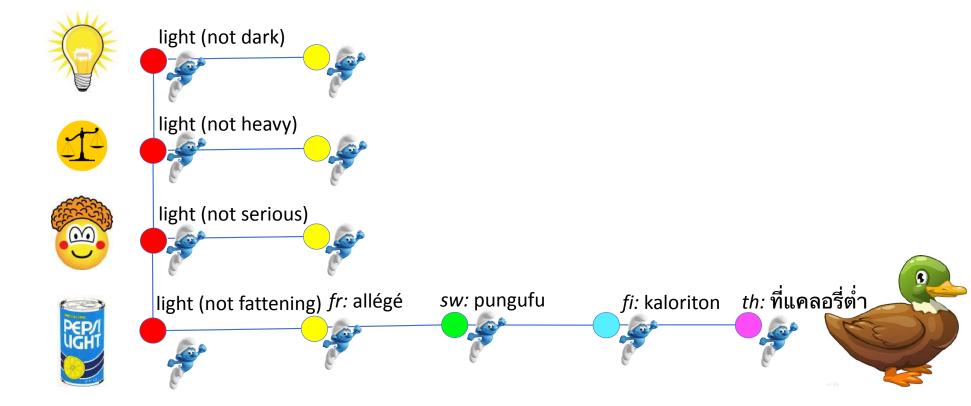




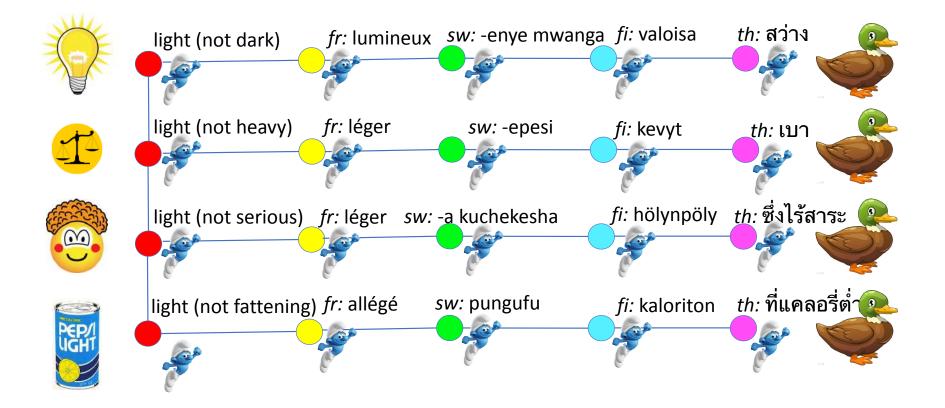




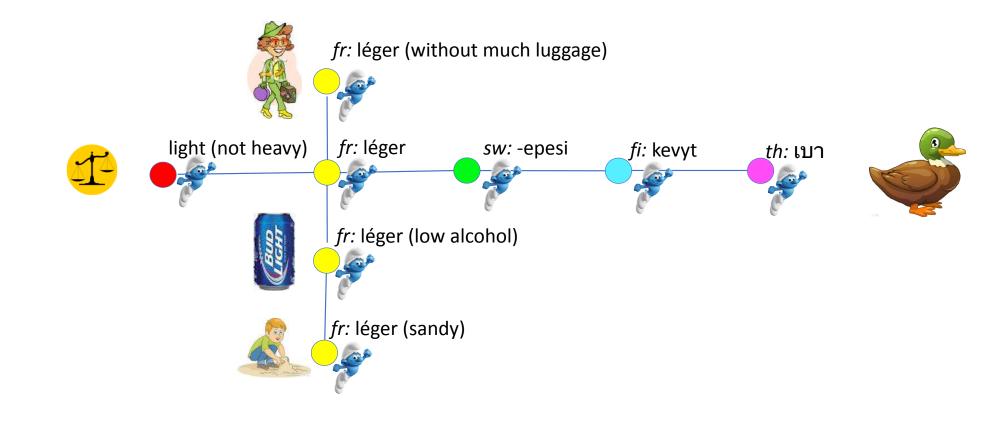








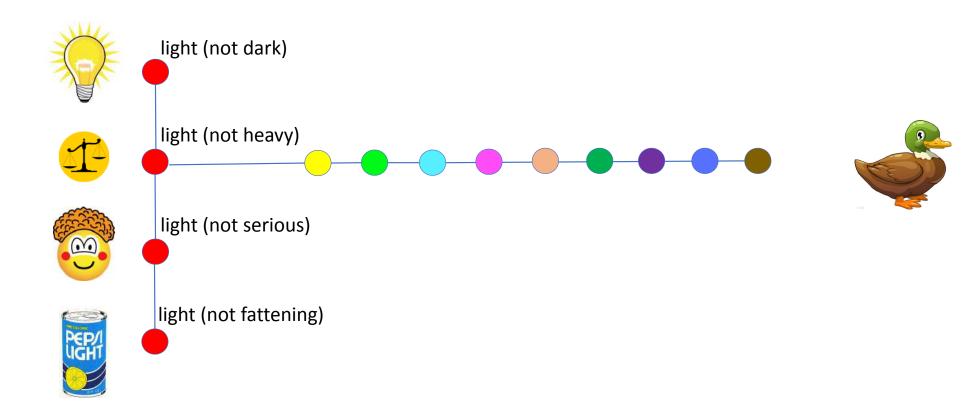




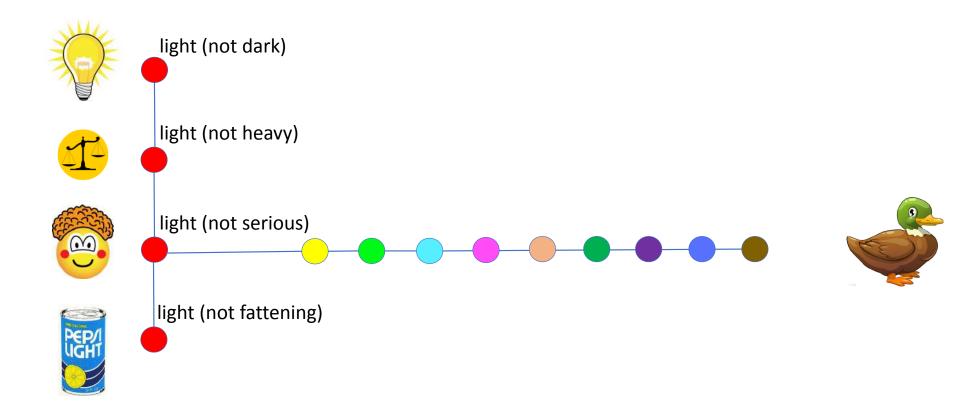




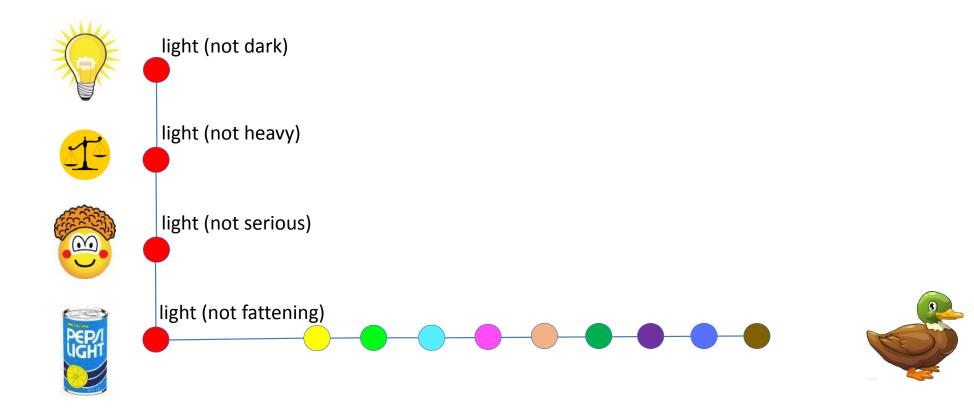




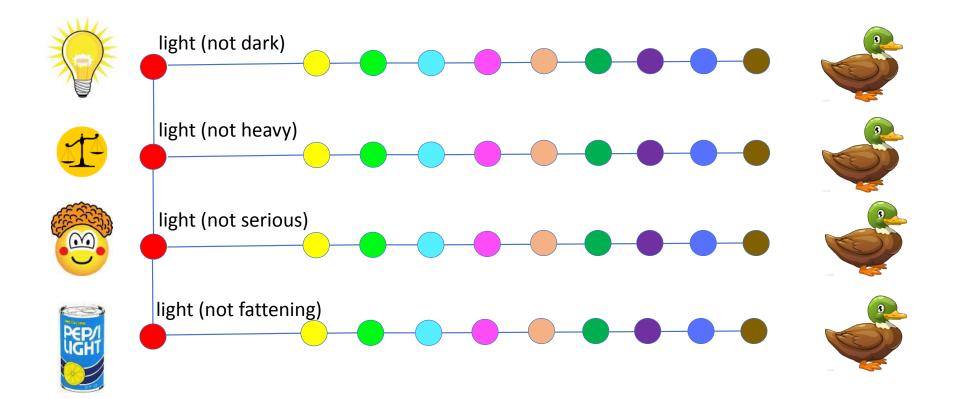














- November 2020 census:
- 2,099,419 Smurfs
- 122 Languages



- Smurfs and Ducks
- Kam4D kamu.si/ kam4d
- SlowBrew
- ~138,000 Ducks
- 44 Languages



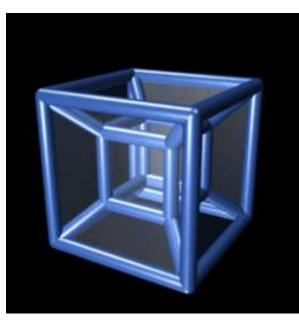
- Smurfs and Ducks
- Kam4D
- SlowBrew





- 4D = Four Dimensional
  - Time is the fourth dimension capacity to treat language change and historical languages
- Graph database structure for a complete matrix of human expression across time and space
  - the structure is realistic; the final goal is an impossible aspiration
- Molecular lexicography design

- Smurfs and Ducks
- Kam4D kamu.si/ kam4d
- SlowBrew

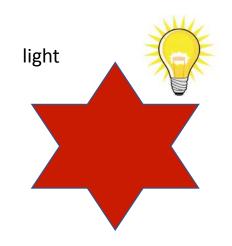




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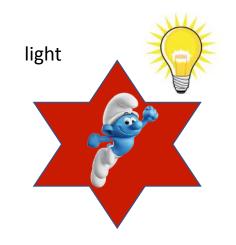






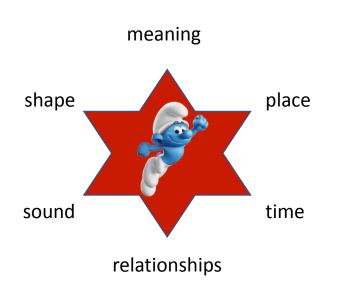
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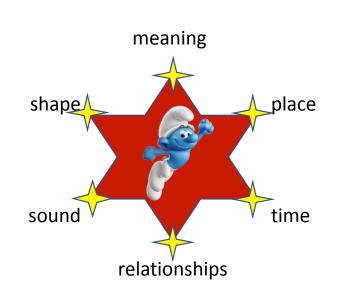
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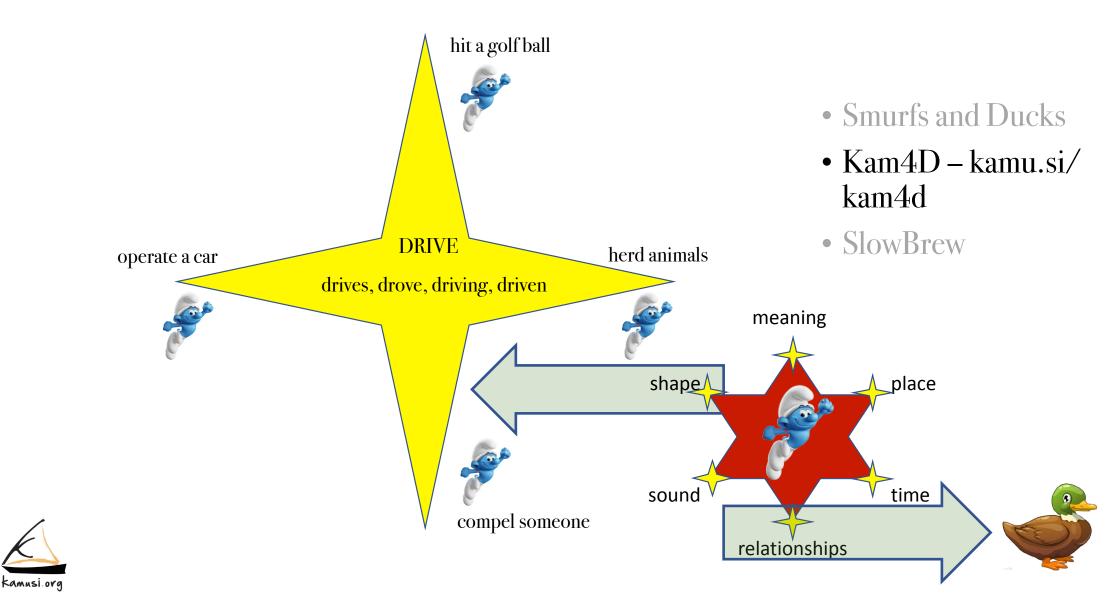
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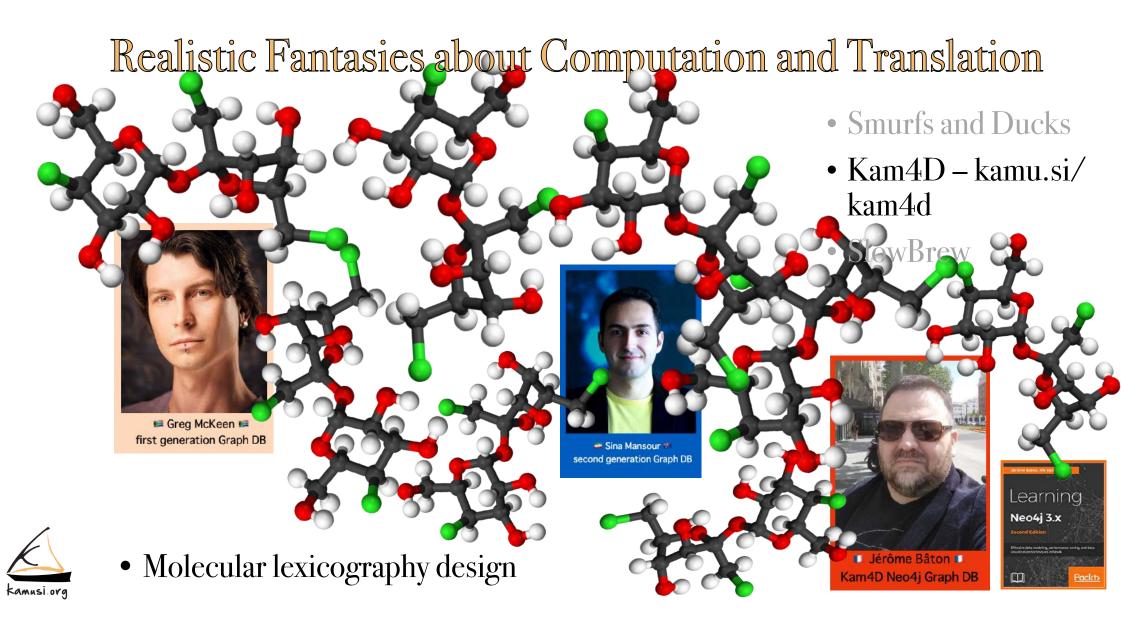




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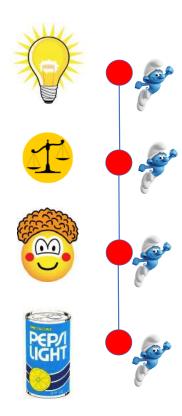


- Smurfs and Ducks
- Kam4D
- SlowBrew





- User selects their meaning on the source side (predisambiguation)
  Users can suggest missing senses



- Smurfs and Ducks
- Kam4D kamu.si/ kam4d
- SlowBrew





- User selects their meaning on the source side (predisambiguation)
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- SlowBrew suggests Party Terms (MWEs), or users can mark their own
  - Party Terms are treated as Smurfs in Kam4D
  - Separated expressions easily conjoined (unlike NMT)

- Smurfs and Ducks
- Kam4D kamu.si/ kam4d
- SlowBrew





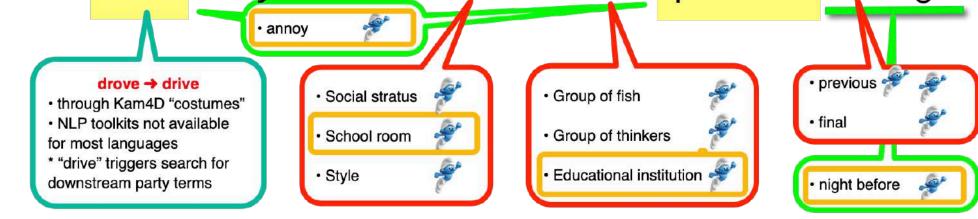


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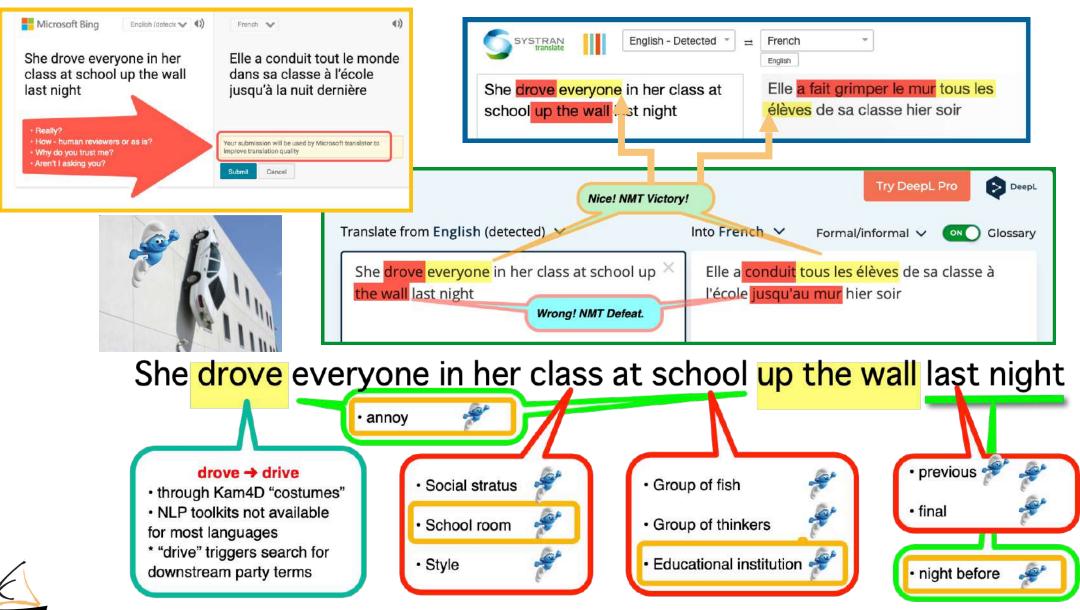
- Smurfs and Ducks
- Kam4D kamu.si/ kam4d



#### She drove everyone in her class at school up the wall last night



kamusi.org



kamusi.org

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- DUCKS finds equivalent term in Language B

- Smurfs and Ducks
- Kam4D kamu.si/ kam4d

coffe







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    - Separated expressions easily rejoined (unlike NMT)
  - DUCKS finds equivalent term in Language B

- Machine learns from context-specific user selections
  - Crowdsourced dataset of spelling/meaning annotations
  - AI builds from human intelligence on the source-side

- Smurfs and Ducks
- Kam4D kamu.si/ kam4d

inst

Coffe

• SlowBrew



- Unanswered Questions:
- Will users take the time to predisambiguate?
  - People take time to choose images
  - People take time to <u>spellchick</u>
- Syntax on the target side?
  - Outside Kamusi wheelhouse partners needed
- How to pay for it?





- Kam4D kamu.si/ kam4d
- SlowBrew





### How AI Cured Coronavirus and Delivered UNIVERSAL TRANSLATION, and Other MT MYTHS AND MAGIC



#### martin@kamusi.org

recommended reading:

- > teachyoubackwards.com
- ≻ kamu.si/kam4d

### Martin Benjamin

18 November 2020 Translating and the Computer ASLING TC42 online *Keynote Address*