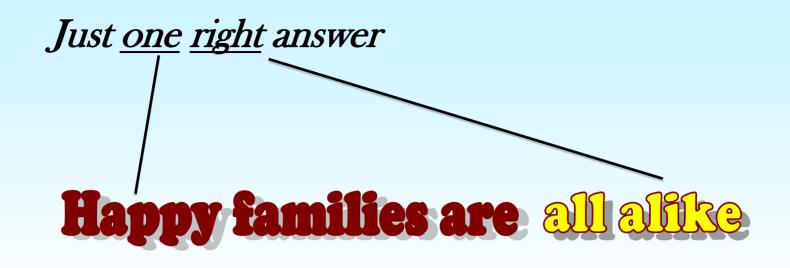


## Happy families are all alike;

every unhappy family is unhappy in its own way.

Leo Tolstoy

"Anna Karenina" [opening line]



# every unhappy family is unhappy



A great many wrong answers

One clichéd ideal [CONVERGENCE to NORM]

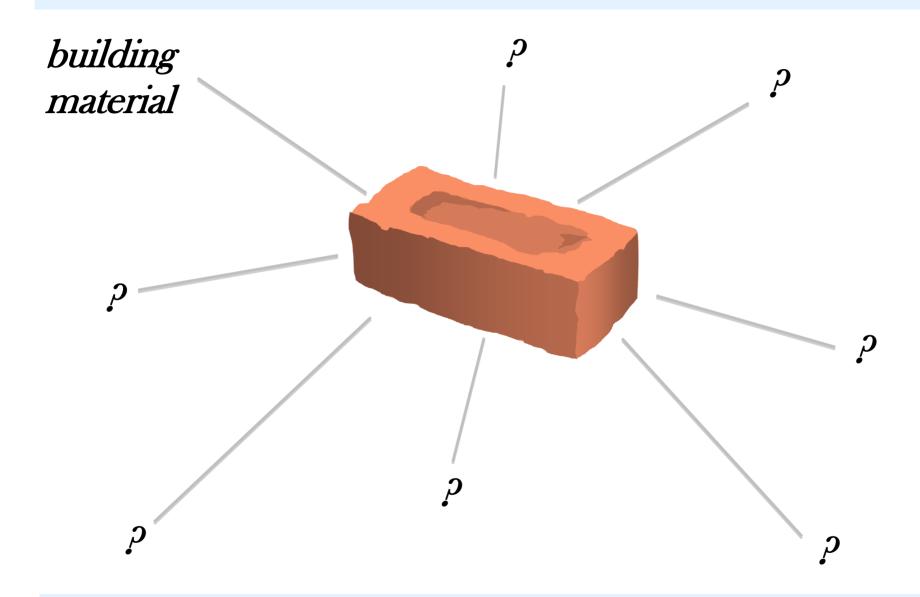


every unhappy family is unhappy

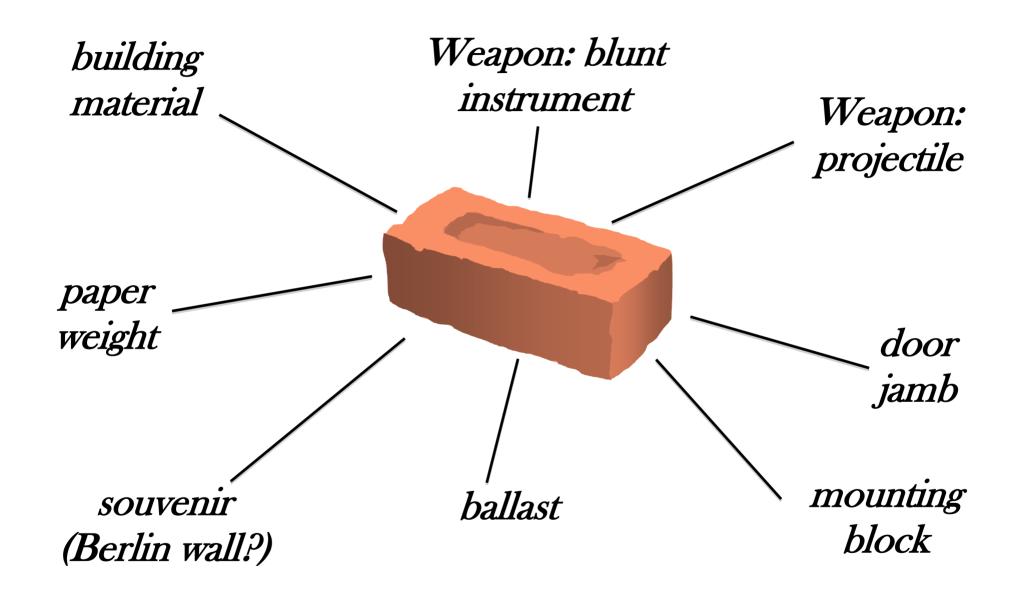


Many non-obvious stories of interest [DIVERGENCE from NORM]

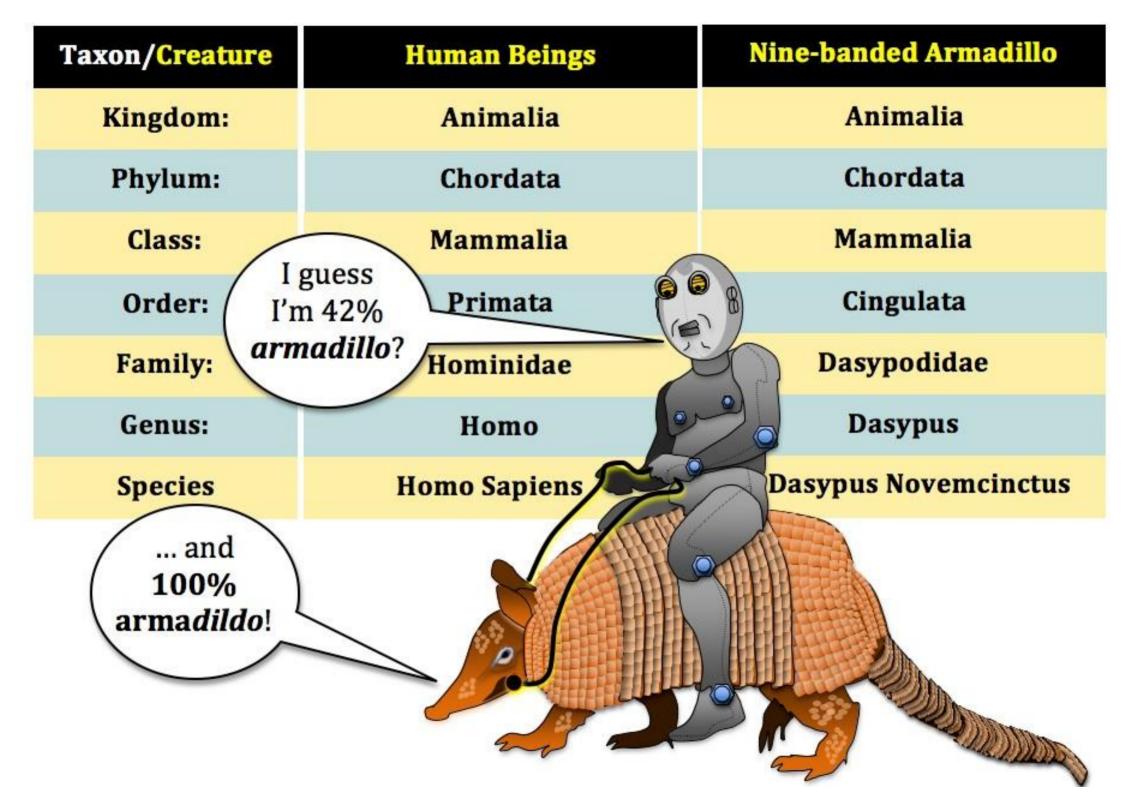
## How many uses can you think of for a brick?



J.P. Guilford E.P. Torrance

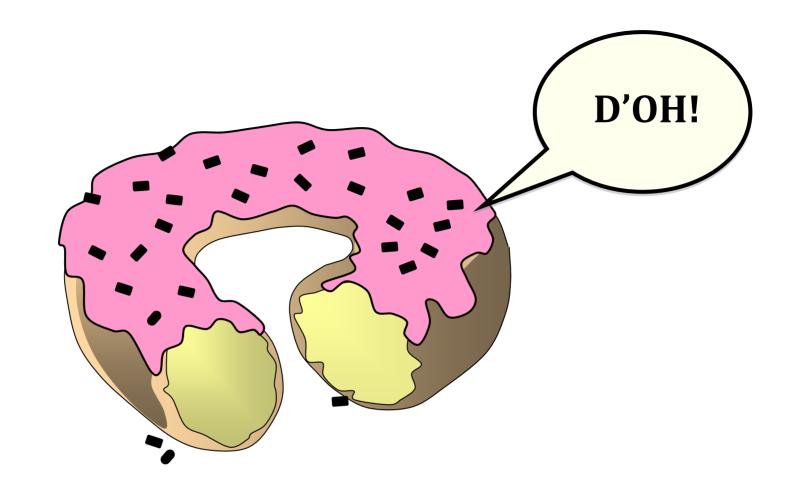


Fluency Flexibility Originality Elaboration





Problem: find a common object that can be used as a safe indoor light source in poor hot countries.



Can you provide a good convergent definition of a **DONUT**?

(One that matches <u>all</u> donuts but <u>no non</u>-donuts)



Well, what are the most obvious shared properties of donuts?

But, innovative divergence in the donut industry means that ...

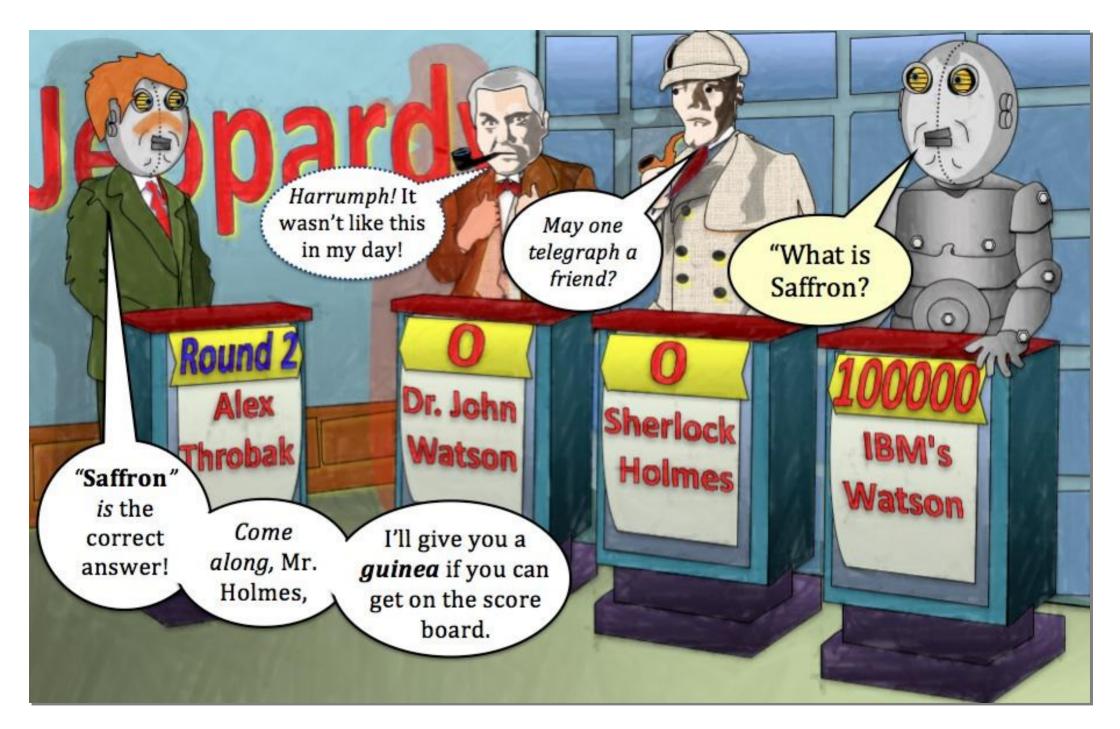


... not all donuts are round, or even have a (single) hole in the middle.

Likewise, not all tasty fried/baked edible toroids are donuts.



We perceive donutness relative to received norms, not strict definitions.



Divergent Production: More than the expected "right" answers



### Scene: A rural motel. Lorne Malvo enters on a cold dark evening ...

Malvo: I need a room.

**Clerk**: Just you?

**Malvo:** What difference does that make?

**Clerk**: It's a different rate for two. And if you've got

pets ... dog, cat ... it's an extra ten bucks.

Malvo: What if I got a fish?

**Clerk**: Excuse me?

Malvo: Would a fish cost me ten dollars?

Malvo: Or what if I kept spiders?

Malvo: Or mice.

Malvo: What if I had bacteria?

**Clerk**: Sir, bacteria are not pets.

Malvo: Could be.

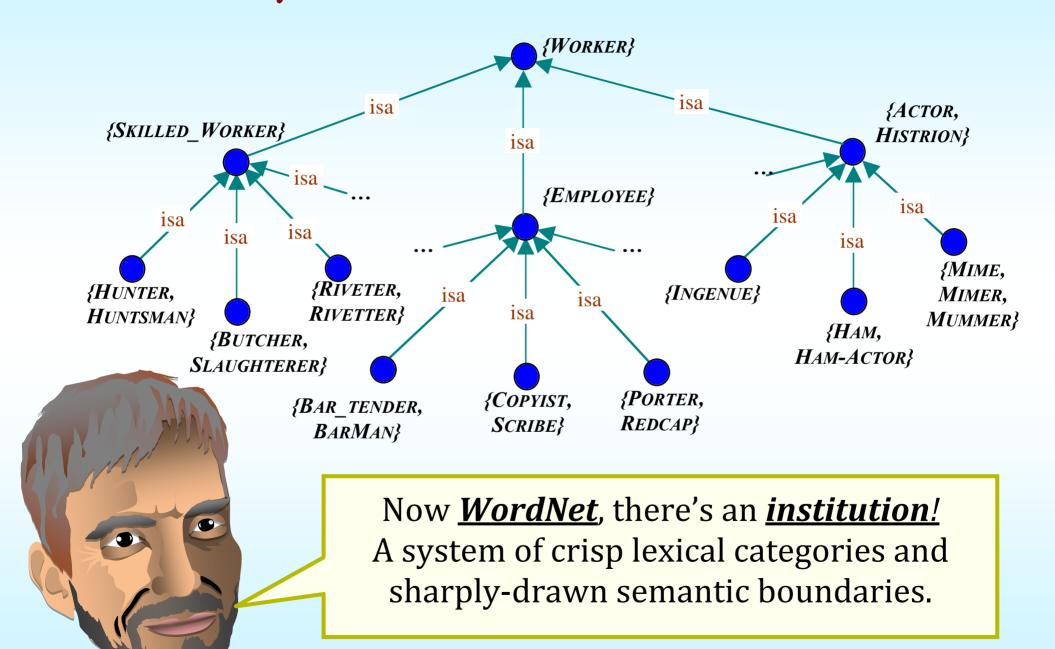
**Clerk**: Sir, perhaps you'd be happier in a different motel?

You see,
I'm a student
of institutions.



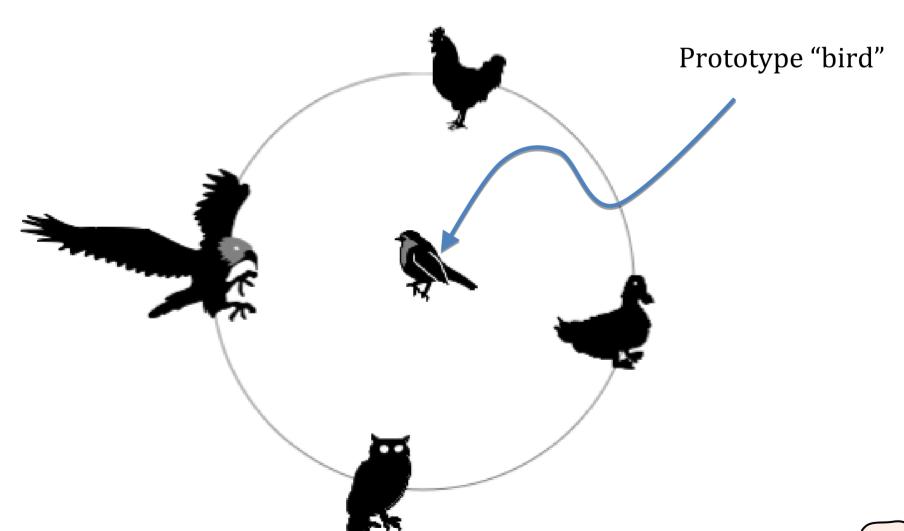
## Fargo, Season 1, episode 1

## WordNet, A lexico-semantic institution





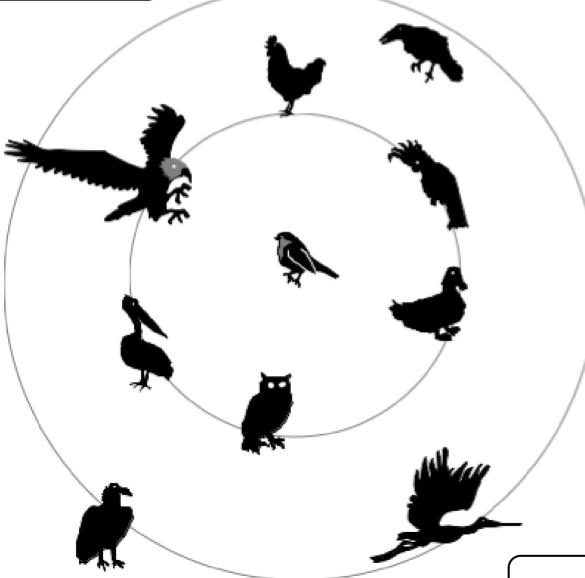




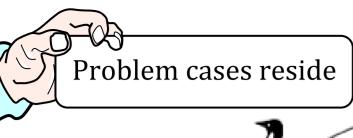
"Radial" Categories

As we go from centre



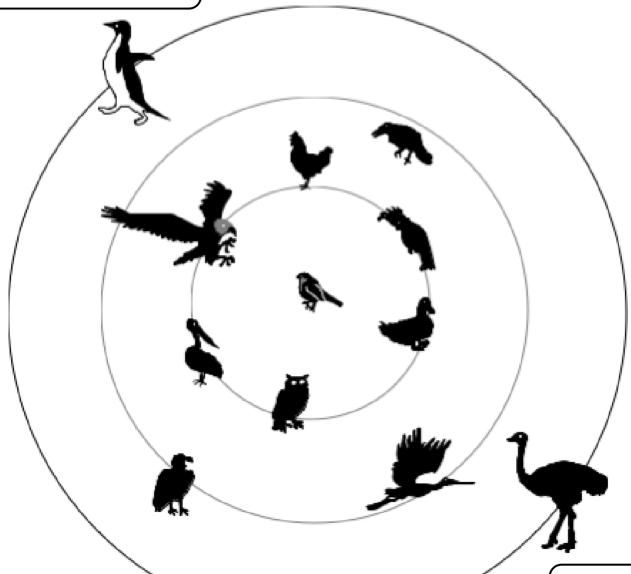


cases are less typical

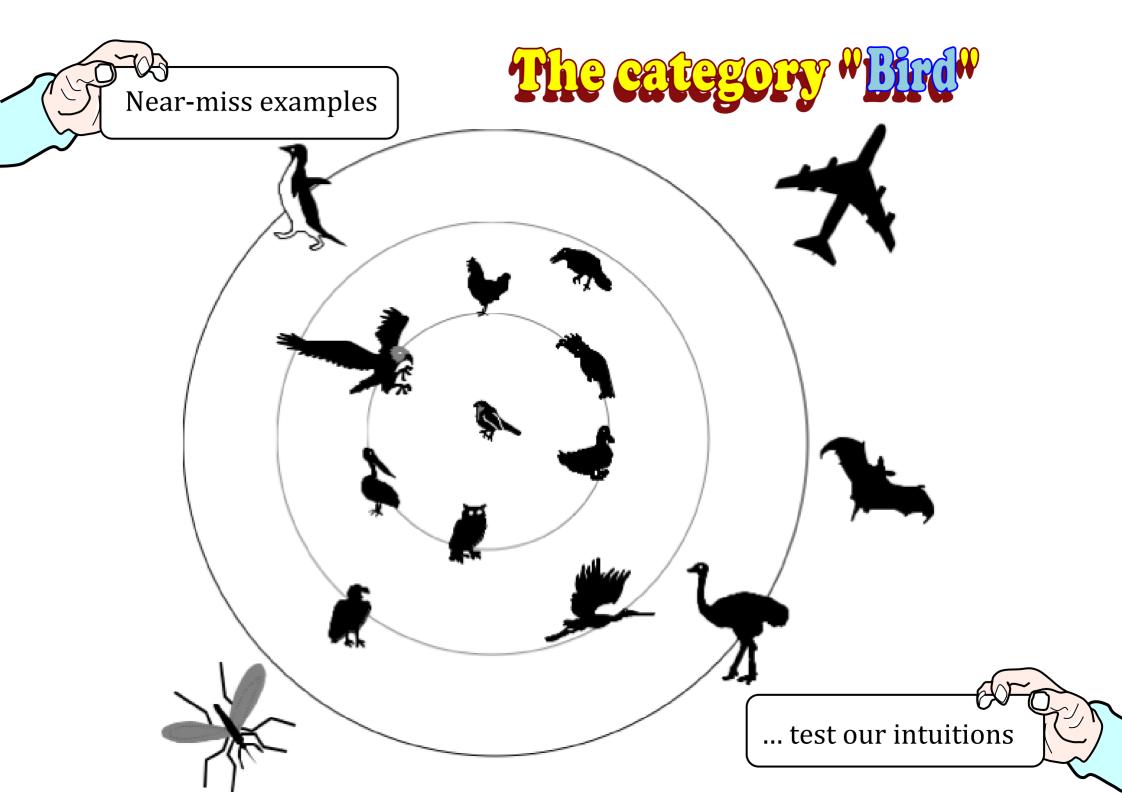








on edge of categories



Rather than use fixed category structures, we can look for how ideas actually cluster together.

Google

I'm Salt



I'm **Pepper** 

salt

and

pepper

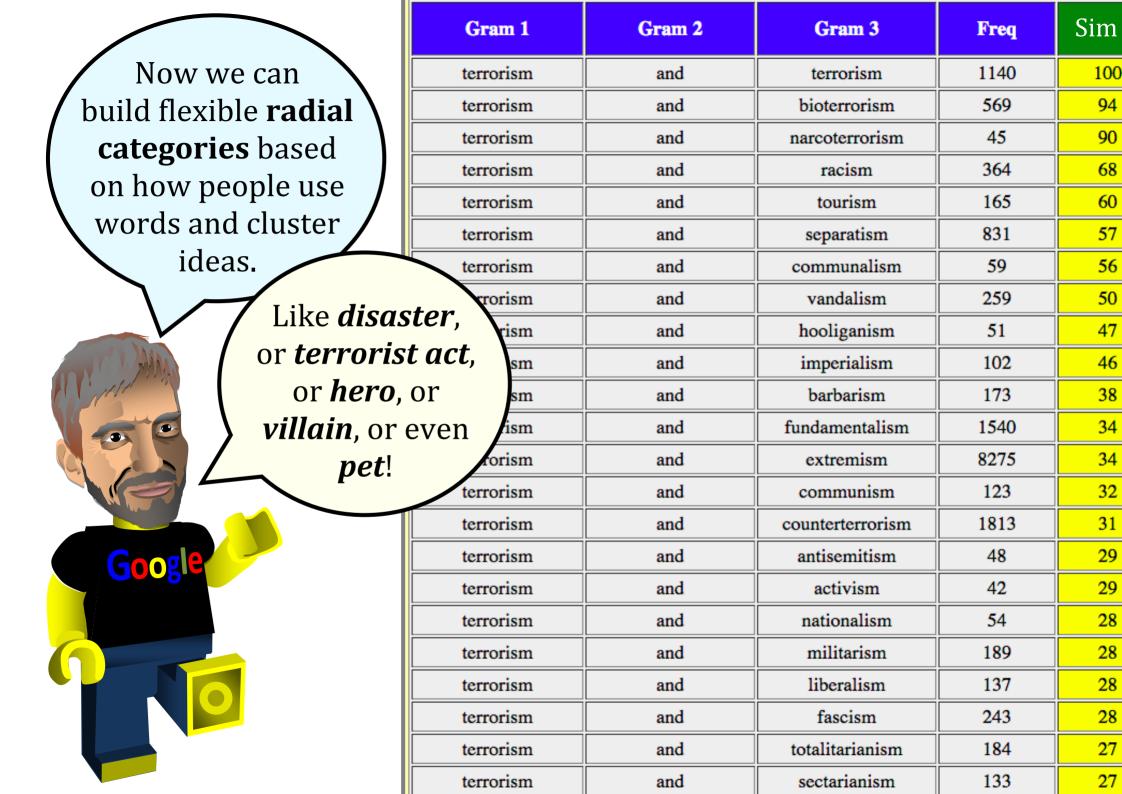
724197

Intuitively, we coordinate ideas that **belong together**. As the linguist **Eric Firth** famously said, "You shall a word by the company it keeps."

So we use the *Google n-grams* to build categories.

Gram 1	Gram 2	Gram 3	Freq	Sim
disaster	and	disaster	736	100
disaster	and	catastrophe	626	99
disaster	and	calamity	216	98
disaster	and	destruction	718	90
disaster	and	plague	68	89
disaster	and	hardship	89	89
disaster	and	famine	635	89
disaster	and	misfortune	250	88
disaster	and	death	1397	80
disaster	and	accident	824	77
disaster	and	trouble	60	76
disaster	and	attack	71	74
disaster	and	misery	225	73
disaster	and	emergency	9649	69
disaster	and	scandal	121	67
disaster	and	humiliation	154	66
disaster	and	development	399	66
disaster	and	suffering	921	65
disaster	and	change	64	65
disaster	and	woe	86	64





Gram 1	Gram 2	Gram 3	Gram 4	
sharp	as	a	tack	
smart	as	a	whip	
sharp	as	a	razor	
sharp	as	a	knife	
close	as	a	blade	
wise	as	a	serpent	
sharp	as	a	pin	
sharp	as	a	needle	
thick	as	a	pencil	
thin	as	a	pencil	
clear	as	a	crystal	
sharp	as	a	sword	
straight	as	a	dart	
sharp	as	a	whip	
sharp	as	a	blade	
clean	as	a	pin	
sharp	as	a	dagger	
clear	as	a	diamond	
keen	as	a	razor	
fast	as	a	shark	
quick	as	a	whip	
flat	as	a	tack	
qualified	as	a	specialist	

We can also use Web data to find conceptual norms. Linguistic constructs, such the *as-as-*simile frame "as ADJ as a NOUN" allow us to harvest a rich knowledge-base of stereotypical property norms. **←** These are from the Google n-grams.

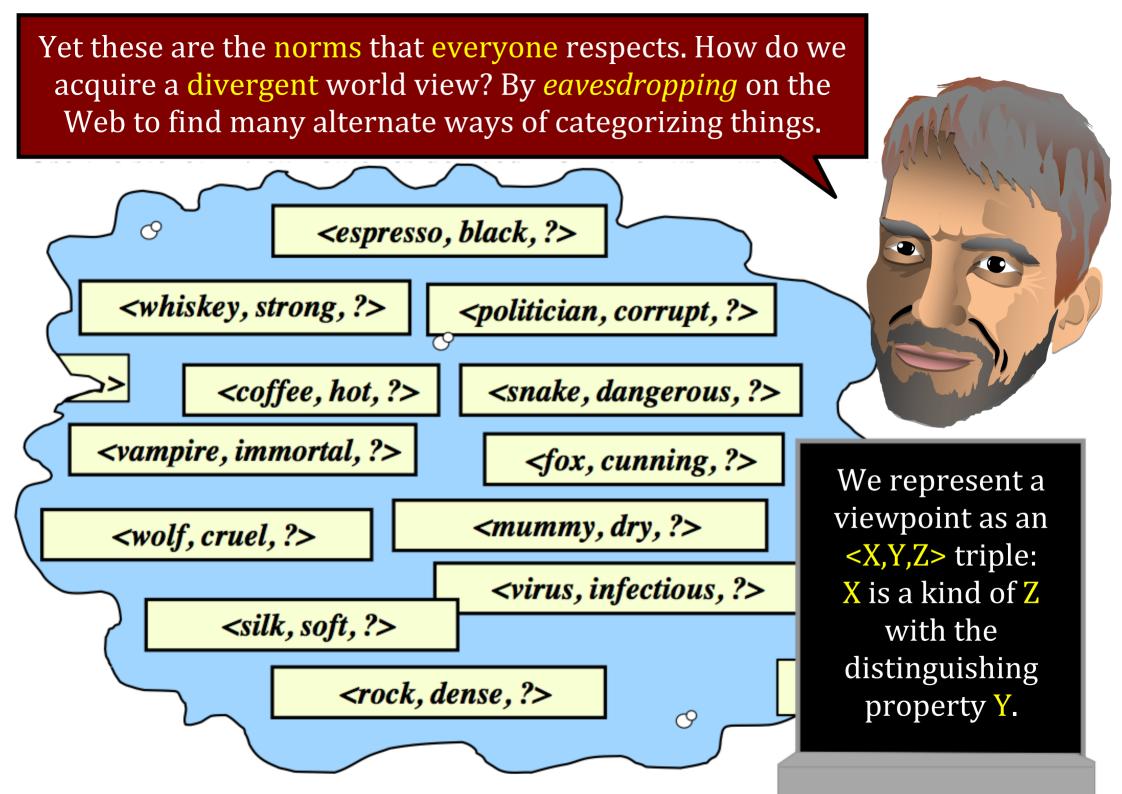


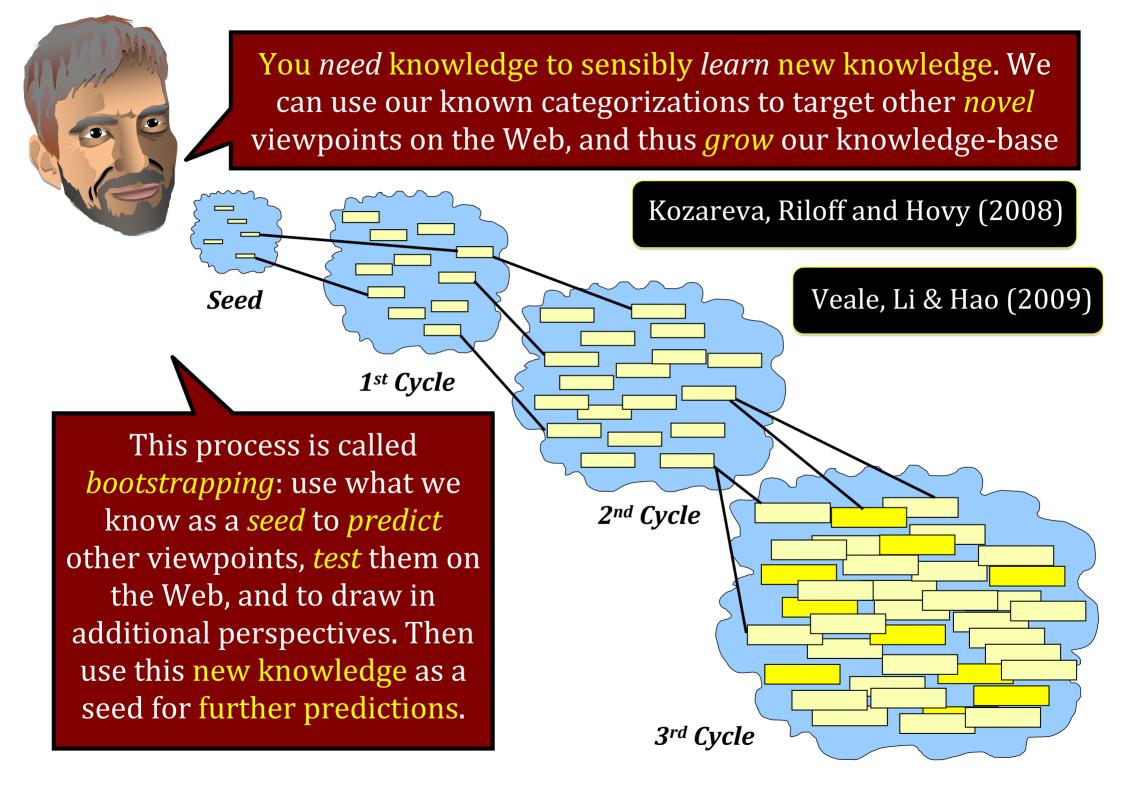
#### Simile associations provide an excellent seed from which to grow a rich knowledge-base.

For instance, Web similes tell us (and our computers) that **foxes** are *cunning*, that **espresso** is *black* and *strong*, that **whiskey** is likewise *strong*, that **mummies** are *dry*, **silk** is *soft*, and so on.

These associations are landmarks in a conceptual landscape relative to which many other points on the landscape can also be identified. What other animals are commonly considered cunning? Which other beverages are black, or strong? What other materials are soft?

We construct a triple from each of these simile-derived associations, but leave the third part of the triple blank, as similes do not explicitly identify a category for the topic being described. This third part can be identified later, during the first stage of bootstrapping on the Web.







It takes knowledge to acquire knowledge, for it takes insight to pose a meaningful question.

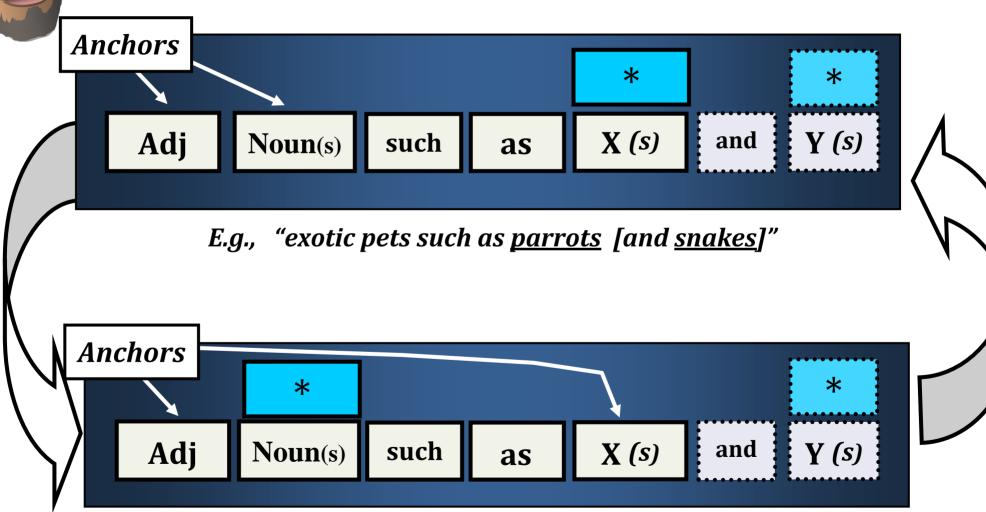
For instance, if we know that **Caviar** is **expensive**, we can ask just what kind of expensive item is it?

The simile pattern is frequently used for ironic ends. To sidestep irony we need a bootstrapping pattern that is very rarely used ironically. The "*M-Xs such as Ys and Zs*" construct is such a pattern.

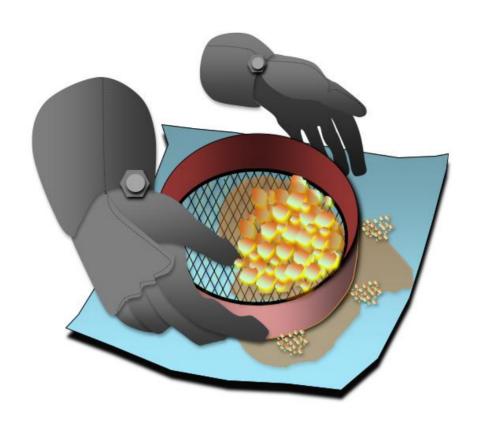
We can re-express *Y*=**Caviar** *is M*=**expensive** as the Web query "expensive \* such as Caviar and \*" to find a value for **X** (the category of **Caviar**) and for **Z** (another expensive item like **Caviar**).

Suppose we learn that Caviar is an **expensive** *food*, and that **Salmon** is too. We can now use the association **Salmon** is an **expensive** *food* in further bootstrapping, and so on and on.

If we know that parrots are exotic pets, we can find other exotic pets (like snakes) with anchored Web queries. We can then find new categories (exotic delicacies?) for them.



E.g., "exotic delicacies such as snakes [and giant water bugs]"



### Bootstrapping grows a knowledge-base at a rapid-rate, since each existing association spurs

the acquisition of many more in the next cycle. Bootstrapping is a *knowledge-magnification* process.

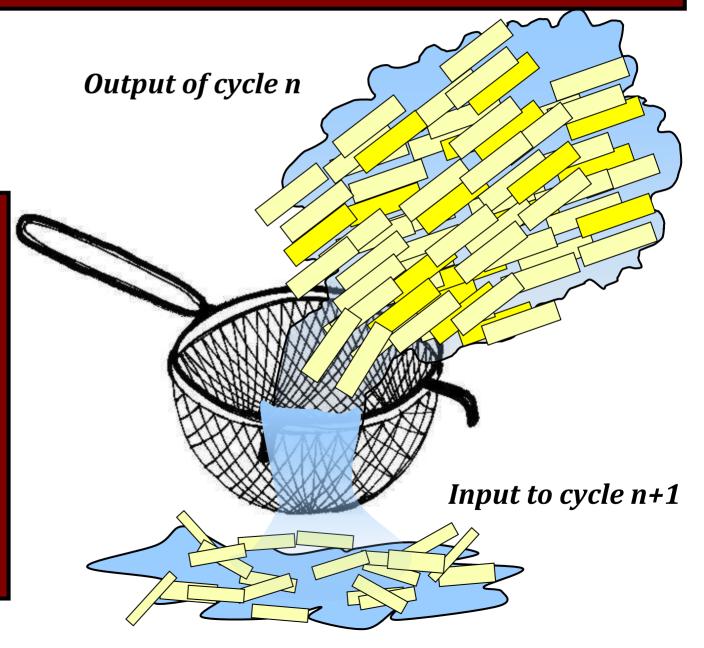
However, the process is not immune to noise, which can cause it to acquire dubious or nonsensical triples. This noise will be magnified many times over in subsequent cycles. *Garbage in, Garbage out*.

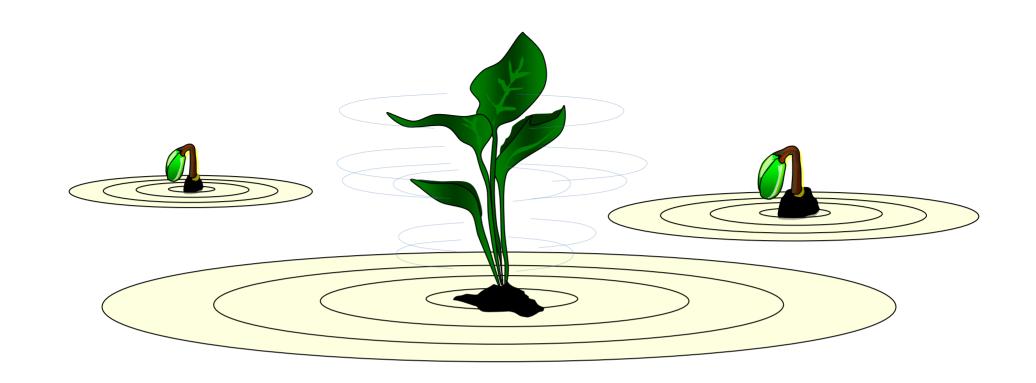
It is thus essential that newly acquired triples are carefully vetted, and that noise is filtered *after each cycle*, lest in metastasize wildly (and prompt many unnecessary queries to the Web).



It is, of course, difficult to tell creative divergence from plain stupidity, wickedness or the noise of the Web. We need to filter what we find, especially as it is *quickly magnified*.

We can use **WordNet** as a *coarse filter* on the new perspectives we acquire. A perspective <X,Y,Z> is deemed valid only if WordNet agrees that *X* has a *sufficient taxonomic similarity to Z*. We filter ruthlessly between every bootstrapping cycle!





#### Every bootstrapped triple represents an attested *fine-grained* categorization of a given topic.

These fine-grained categories are *radial*. If the same triple is found again and again for a topic, then this topic is deemed to be a highly representative member of the corresponding radial category.

Bootstrapping is a productive means of growing a large number of fine-grained radial categories, and of growing the membership of these categories by identifying attested members on the Web.

We have constructed a Web service called *Thesaurus Rex* that delivers these categorizations on demand for a given topic. The *size* of a category name conveys the representativeness of the topic.



Thesaurus Rex is a Creative Web Service for supporting Divergent categorization in 3<sup>rd</sup> party applications.

Check out Afflatus.UCD.ie for more information.





Veale & Li (2013)

creativity

subjective:skill, personal:skill,

personal:attribute.

essential:skill, soft:skill, professional:attribute, mental:ability, spiritual:attribute,

entrepreneurial:skill, academic:ability, subjective:thing, musical:ability, subjective:thing, important:attribute, key:skill,

psychological:attribute, individual:skill, nonverbal:skill, personal:motive, cognitive:skill, nonverbal:skill,

important:skill, social:attribute, psychological:attribute, desirable:attribute, entrepreneurial:attribute, abstract:skill,

intellectual:ability, social:skill,

diverse:attribute, cognitive:power, commercial:skill, technical:skill, mental:faculty, intellectual:skill, noble:attribute. artistic:skill, athletic:skill, feminine:attribute, feminine:a mental:attitude, rare:event

individual:motivation, mental:attribute, positive:attribute, wonderful:thing. behavioural:skill,

positive:attitude, individual:attribute, spiritual:power, cognitive:ability,

ital:skill, interpersonal:skill,

mental:skill,

professional:skill,

see Afflatus.UCD.ie

### The bigger a category in the retrieved perspective set, the more frequent that perspective is on the Web. Most people think of cola as a dark, acidic, sugary, soft drink.

Top-Ranked Fine-Grained Categories of cola: =>see poetic categories

common:food, nice:thing soft:drink,

acidic:beverage, dark:beverage,

cold:soda, acidic:drink, dark:liquid, dark:drink,

stimulating:drink,

dark:food, sugary:food, carbonated:drink, simple:mixer, fizzy:drink,

sugary:drink, clear:drink, acidic:liquid, clear:liquid, colored:fluid, clear:beverage, sugary:item,

carbonated:beverage,

colored:soda, coloured:drink, cold:beverage, traditional:beverage, nutritional:value, nonalcoholic:beverage, common:liquid,

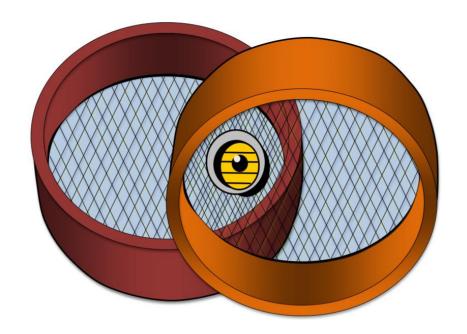
colored:substance, carbonated:soda, dark:soda,

acidic:material, sweet:drink, nonalcoholic:drink, salty:fluid, stimulating:beverage,

refreshing:beverage, colored:liquid,

dark:mixer, mixed:drink,

acidic:food.



#### Good metaphors draw out latent similarities between their topics and their vehicles.

A creative individual spies a curious resemblance between two objects or ideas, and constructs an appropriate metaphor to help others see this otherwise overlooked similarity too.

**Thesaurus Rex** allows its users to explore the hidden or conventionally unnoticed similarities between concepts by **intersecting** the set of radial categories that they both reside in.

For instance, by identifying the fine-grained categorizations that can be applied to both *creativity* and to *leadership* (attested on the Web), we can see the many tacit connections between the two.

# So the fun starts when we consider the *shared perspectives* that unite two very different ideas: coffee and tobacco, say.

Shared Category for coffee and tobacco

acidic\_food, addictive\_substance, agricultural\_item, agricultural\_material, agricultural\_plant, american\_item

commercial\_plant, common\_substance, complex\_mixture, consumable\_item, consumable\_item, consumable\_substance,

dark\_substance, dietary\_substance, diverse\_material, dry\_item, dry\_material, economic\_plant, essential\_item, everyday\_item, everyday\_substance, exempt\_item, exotic\_food, exotic\_item,

exotic\_plant, external\_agent, external\_substance, familiar\_substance, foreign\_material, illegal\_substance, important\_item

foreign\_substance, harmful\_substance, important\_item

| agricultural\_material, agricultural\_material, agricultural\_material, agricultural\_material, agricultural\_material, agricultural\_material, agricultural\_plant, american\_item, agricultural\_plant, agricultu

important\_plant, industrial\_plant, intoxicating\_substance,

irritating\_substance, legal\_intoxicant, legal\_substance, legal\_thing, medicinal\_plant, medicinal\_substance, narcotic\_substance, natural\_material, natural\_substance, new\_substance, new\_substance,

organic\_material, organic\_matter, outside\_agent, particulate\_material, perishable\_item, personal\_item, pleasurable\_substance, poisonous\_plant, poisonous\_substance, psychoactive\_plant,

psychoactive\_substance, raw\_material, recreational\_substance,

For instance, coffee and tobacco are both addictive, harmful, legal everyday substances derived from exotic plants. And psychoactive too!



## creativity & leadership

## Veale & Li (2013)

#### Shared Category for creativity and leadership

```
entrepreneurial_skill, essential_skill, intellectual_skill, interpersonal_skill, mental_attribute, natural_ability, necessary_attribute, new_skill, personal_attribute, new_skill, personal_attribute, new_skill, personal_attribute, new_skill, new_skill, personal_attribute, new_skill, new_skill, personal_attribute, new_skill, new_s
```

personal\_skill, positive\_attitude, positive\_attribute, professional\_attribute, professional\_attribute,

professional\_skill,

qualitative\_attribute,

social\_skill,

soft\_skill, special\_ability, special\_attribute, special\_subjective\_attribute, subjective\_measure,

subjective\_thing, technical\_skill, transferable\_skill, valuable\_skill, vital\_skill, vocational\_skill, valuable\_skill, valuable

So what is the relationship between two vaguely connected hard-to-define ideas? The categories reveal all! By finding non-obvious (non-coded) viewpoints to unite disparate concepts, we can build a model of *creative metaphor*. Consider the shared perspectives that unite divorce and war:

```
adverse_event, bad_event, bad_thing, catastrophic_event, changing_event,
                                                                critical event, of
devastating_event, disruptive_event, distressing_event, domestic_conflict, domestic_event,
                                                   dramatic_event,
economic_event, emotional_event, environmental_event, experienced_event,
                                                                external_event,
extraordinary_event, financial_event, identifiable_event, immoral_act, important_event,
                                              ordinary_event, outside_event, painful_event, past_event,
         major_event, negative_event,
                                              rare_event, recent_event, severe_conflict,
                                                           severe event.
                       ingle_event, social_event, social_occurrence,
significant_event,
                                                              stressful_event,
                                                       unanticipated_event, unavoidable_event,
sudden_event,
                        traumatic_event, uncontrollable_event, undesirable_event,
                           unexpected_occurrence, unforeseeable_event,
unexpected_event,
                           unforeseen_event, unfortunate_event,
                                                      unpleasant_event,
                       untoward_event, unusual_event,
unpleasant_thing,
```

# Even opposites like birth and death share many profound similarities, provided you look for them in the right place (hint: it's not WordNet!)



Each is a vital, stressful, legal, natural, traumatic, meaningful, timeless and irreversible event.

unanticipated\_event, universal\_experience,

```
historical_event, identifiable_event, important_event, individual_event, infrequent_event,
inorganic_object, irreversible_event, isolated_event, large_experience, legal_event, local_event,
main_event, major_change, major_event, major_occurrence, meaningful_activity, meaningful_event, meaningful_event, natural change,
                                                                                                            natural_event, natural_experience,
                                                                                                                                                                                 natural occurrence,
natural_phenomenon, natural_process,
                                                                                                                                                                                            natural_thing, notable_event,
                                                                                                                                                                                                                                              observed_event,
 onetime_event, ordinary event, ordinary_experience, ordinary_occurrence, ordinary_thing, organic_event,
organic_process, organizational_event, particular_event, past_event, personal_change, personal_event,
 physical_event, physical_phenomenon, physical_transformation, physiological_event, physiological_process, possible_event, private_experience,
                                        public_entity, public_event, random_event, random_occurrence, recent_change, recent_event, random_occurrence, ra
                                                                                  round event, routine event,
                                                                                                                    social event.
                                                                                                                                                                                             social phenomenon.
significant_event,
                                                                                                                                                                   special_event, special_occasion,
stochastic_process, stressful_event, timeless_experience, traumatic_event,
```

vital event,

traumatic\_experience,





#### Words are tools that we too often assume possess just a single prescribed functionality.

An important function of metaphor is to reveal the secondary functions of our words, to show that the ideas conveyed by two very different words can share some surprising similarities.

Since metaphor facilitates our recognition of the similar in the dissimilar, it may contribute to our sense of similarity overall. Can *Thesaurus Rex*'s categories enhance a general sense of similarity?

Measures of the semantic similarity of two words (and their meanings) are usually evaluated on the *gold standard* of Miller & Charles (**M&C**)'s 30-word-pairs ranked by human similarity judgments.

For *divergent*perspectives to be useful, they must contribute to our overall sense of a word/idea.

## I'm George Miller

#### I'm Walter Charles



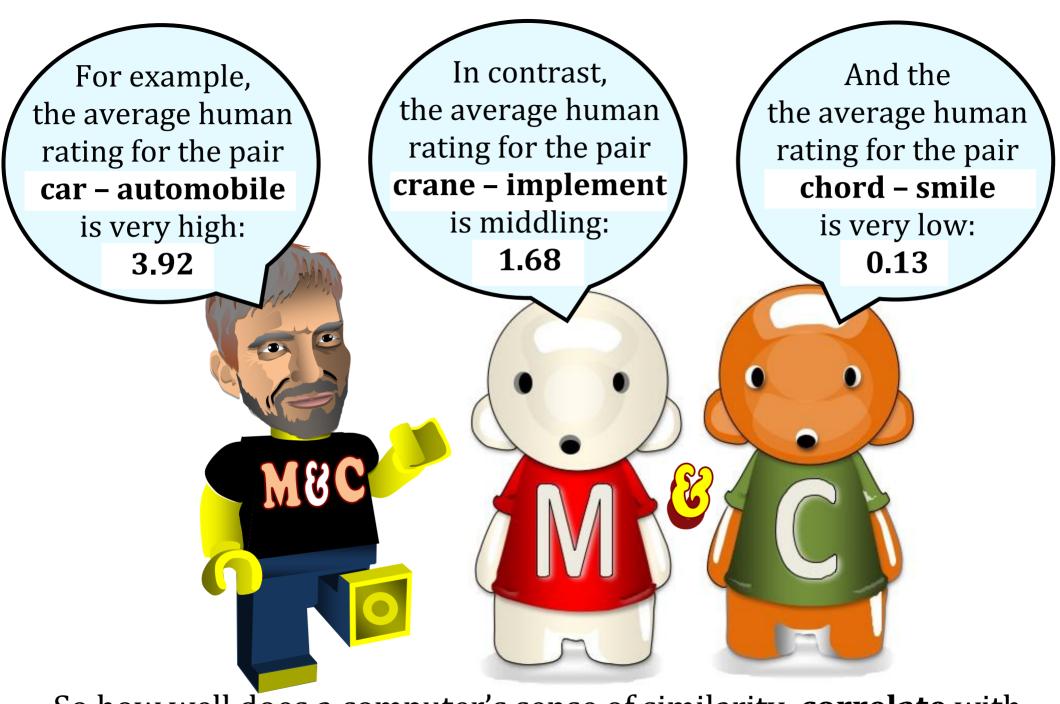
George A. Miller & Walter G. Charles created a seminal *gold-standard* for *similarity judgments*. The M&C dataset contains *30 pairs of words*, each pair rated for similarity by multiple human subjects.

## Miller & Charles (1991) Lexical similarity Gold-Standard of 30 word pairs

```
car - automobile 11. bird - cock 21. coast - hill
   gem - jewel 12. bird - crane 22. forest - graveyard
  journey - voyage 13. tool - implement 23. shore - woodland
   boy - lad 14. brother - monk 24. monk - slave
  coast - shore 15. crane-implement 25. coast - forest
  asylum- madhouse 16. lad - brother 26. lad - wizard
   magician - wizard 17. journey - car 27. chord - smile
   midday - noon 18. monk - oracle 28. glass - magician
  furnace - stove 19. cemetery - woodland 29. rooster - voyage
10. food - fruit 20. food - rooster 30. noon - string
```

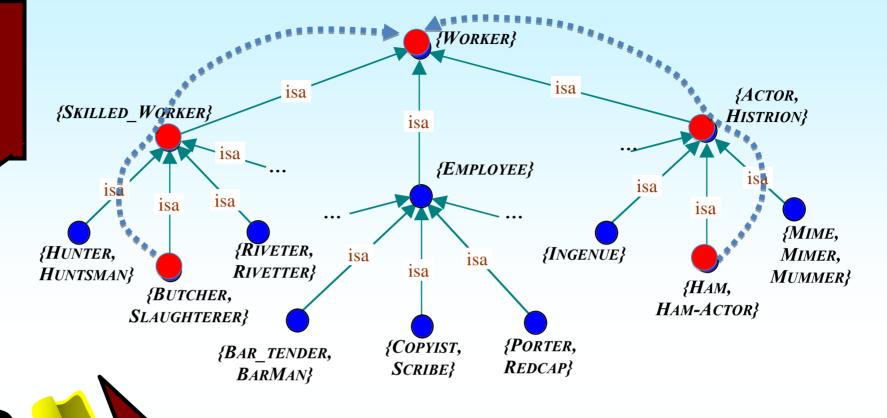
**Computers achieve 0.76 – 0.93 correlation with M&C human ratings** 

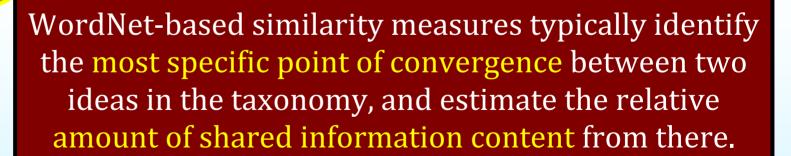
see Veale & Li (2013) for implementation of similarity measure using T. Rex



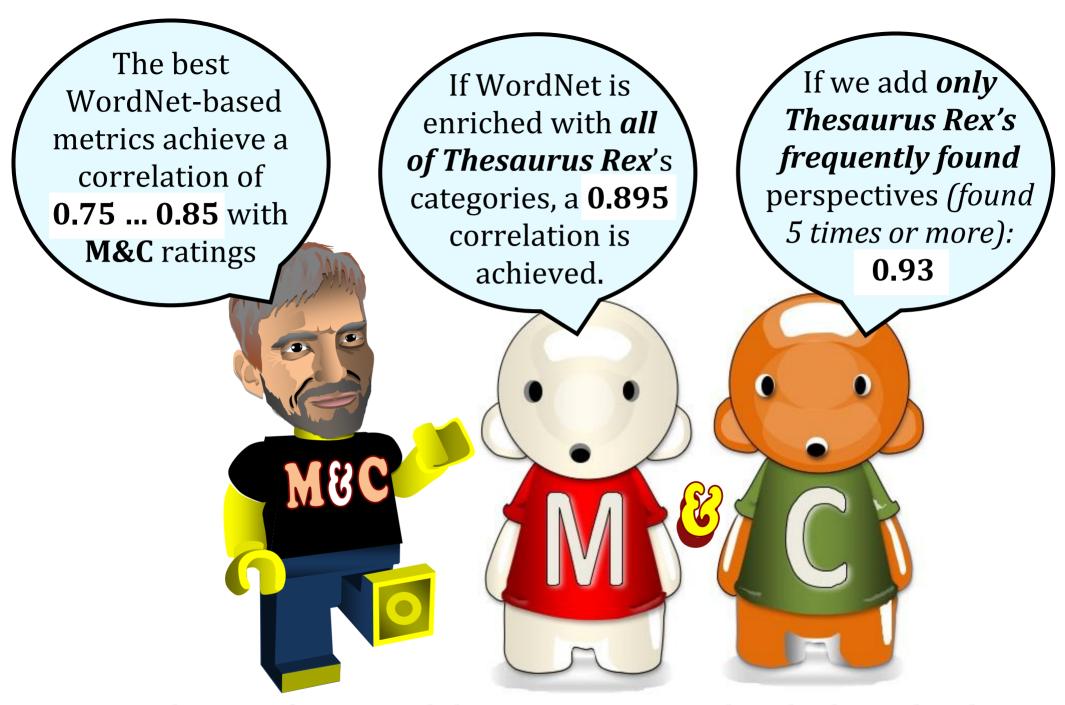
So how well does a computer's sense of similarity **correlate** with these average human ratings for the same word-pairs?

As with the Linnaean taxonomy ...



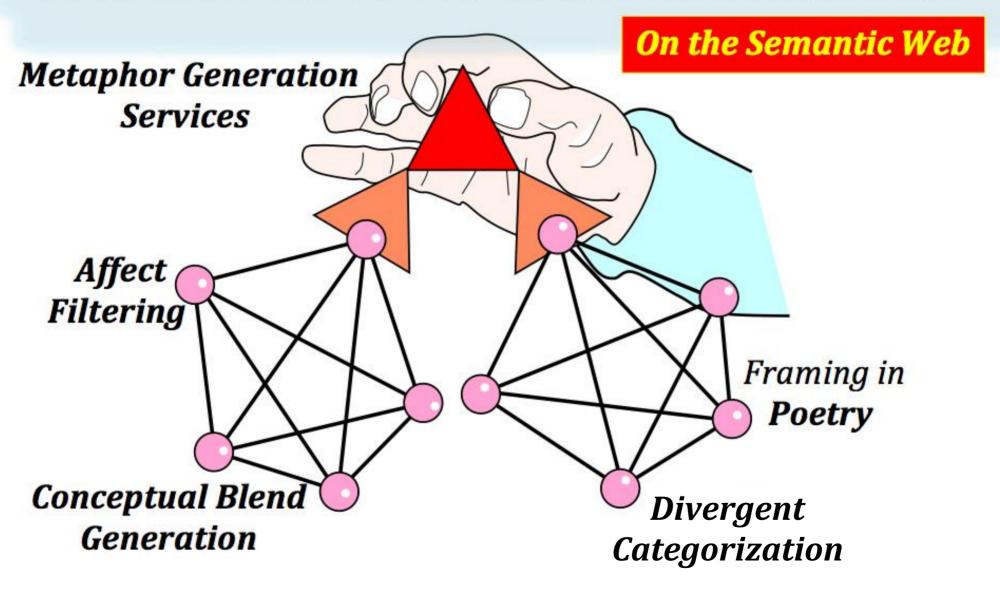


The more points of convergence there are, the greater the opportunity for similarity to be perceived.



A correlation of **0.93** with human ratings is also the best that has been achieved with *opaque* machine-learning (SVM) methods.

## A WEB OF CREATIVE METAPHOR SERVICES



Check outs

Afflatus. UCD ie

So what if a diverse assortment of metaphors could be *created on demand* for any given topic?

A Web Service called *Metaphor Magnet*can be used to *commoditize* creative metaphors for use in  $3^{rd}$ -party



Metaphor Magnet will
even generate poems
 (ahem) for your
metaphors on demand.



Support me with your fervent attack

Spiritual beliefs does Apple enforce

No genius is more deranged, or more secretly obsessed

Fascinate me with your secret depravity

Let your religious control inspire me

Did ever a guru create a more infamously bizarre cult?

How you spread to me so secretly, like a revered cult

Does any cult brainwash more secretly than this Apple?

You secretly spread to me with your spiritual obsessions

Just as the most devoted priests serve the most loving deities, the most devoted cults worship the most loving gods

Would a saint rather be worshipped by cults containing charming vampires or threatening demons?

O Apple, you oppress me with your dogmatic spirituality





This CC twitterbot uses the **Metaphor Magnet** Web-service to tweet a new divergent perspective every hour or so.



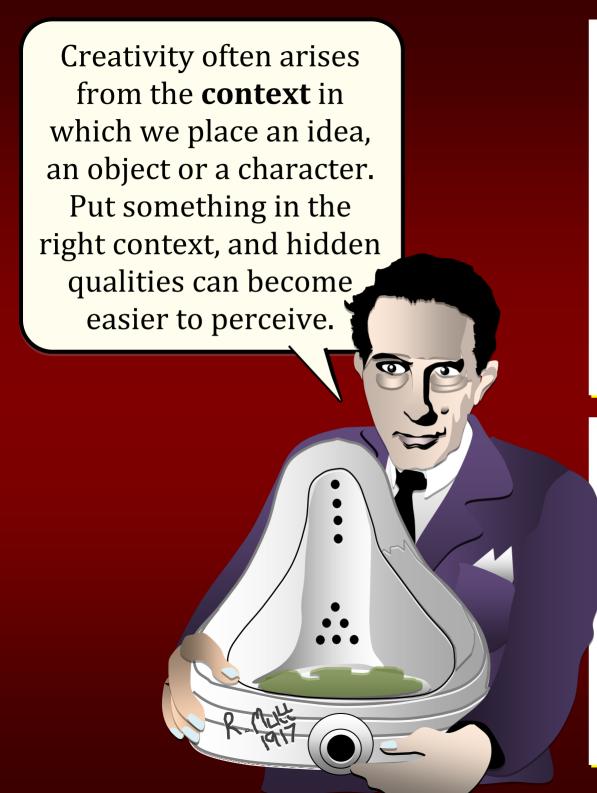
MetaphorIsMyBusiness @MetaphorMagnet · 14h

.@wealth\_god says money is a compelling mystery

.@criminal\_analyst says it is a boring bank #Money=#Mystery #Money=#Bank MetaphorisMyBusiness @MetaphorMagnet · 9h

#Irony: When valuable pearls glow like the most worthless cigarette butts.

#Valuable=#Worthless #Pearl=#Cigarette\_butt





#### #Alarm

- 1. A timed alert
- 2. A blinking clock
- 3. A warning device
- 4. An audible indicator
- 5. A flashing signal



#### MetaphorIsMyBusiness

@MetaphorMagnet

- **#Take5** of the **#Bawdiest** things:
- 1. roadhouses
- 2. romps
- 3. slapstick
- 4. taverns
- 5. bawds
- #Bawdy

# The (Un)usual Suspects

for another. Indeed, most of the divergent uses that we might imagine for an object in the course of the *unusual uses test* will be, in some mundane context, a role or activity that we perceive everyday, either in real life or on TV. However, so strong are our associations for a test object that we cannot easily perceive other possibilities. One way to *ace* the unusual uses test is to use a crib sheet of the most typical uses for *any* object, and simply fit the elements of our inventory to an object.

Suppose we look on the Web for all completions of the phrase "used as a \*", where \* can match any noun. We can use a Google database called the Google N-Grams to quickly find possible noun fillers and their frequency of use in this phrase on the Web. The most frequent fillers – and the most frequent second-uses to which an object might be put – are listed on the following page

Now, let's play the unusual uses game with each of the following test stimuli. For each stimulus, first try to invent your own innovative uses. How many *more* uses can you invent by using the list of common uses on the next page? Feel free to think metaphorically – a "prison" does not have to a real prison, but any restrictive context – and metonymically – an object may not be usable as a "church", but it might be used as an altar, a sacrifice or an offering.

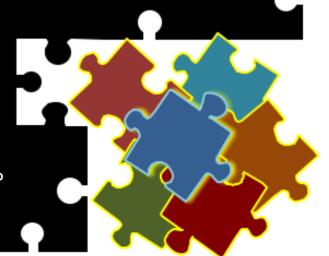
An empty coffee can A cardboard tube A blunt knife A chair leg A windscreen wiper A headless doll A housebrick A microwave oven One boxing glove A spare room A wind-up alarm clock A bag of marbles Scratched CDs One chopstick A plastic bag Unused 1985 diary Doll's head (no body) A garden shed **Used batteries** A ball of string

#### These nouns are all frequently used on the Web to complete the phrase "used as a \*":



Model, weapon, vehicle, symbol, platform, treat, dwelling, catalyst, prison, drug, cure, bridge, light, library, shield, wall, fence, mask, church, classroom, bedroom, spice, car, yardstick, toy, computer, flag, decoration, gift, seed, warning, blueprint, laboratory, vaccine, code, password, threat, blanket, pillow, bookmark, kitchen, cemetery, map, barometer, window, hammer, diaper, marinade, tray, mirror, missile, sensor, rug, lens, sword, diary, bomb, tranquilizer, hook, poison, perfume, joke, chair, compass, cloak, trap, dump, bank, clock, purse, puppet, battery, whip, scarf, pot, cudgel, sink, plate, notebook, bullet, counterweight, hat, sponge, thermometer, keepsake, birdbath, nest, cane, pendulum, bracelet, spear, necklace, clamp, spoon, tomb, brooch, shrine, nail.

- What qualities should the most reusable elements on this inventory possess?
- Is an inventory approach likely to increase or reduce divergence?
- How might you generalize this inventory into a reliable technique?
  - How might your generalized technique be automated?
  - What additional categories would you add to the above inventory?











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