



SemEval-2012 Task 2: Measuring Degrees of Relational Similarity

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Talk Outline

- Motivating Example
- Task Description
- Data Annotation Gathering
- Systems and Performance
- Discussion



The relational search engine

List all things that are part of a ...



The relational search engine

List all things that are part of a ...

Antenna

Hubcaps

Seats

Roof

Wheel

Engine

Tires

Windows



The relational search engine

List all things that are part of a ...

Antenna

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Windows

How might we
rank these items?



The relational search engine

List all things that are part of a ...

- Car:Antenna
- Car:Hubcaps
- Car:Seats
- Car:Roof
- Car:Wheel
- Car:Engine
- Car:Tires
- Car:Windows

These are all analogous pairs, but vary in how strong the relation is



The relational search engine

List all things that are part of a ...

- Car:Antenna
- Car:Hubcaps
- Car:Seats
- Car:Roof
- Car:Wheel
- Car:Engine
- Car:Tires
- Car:Windows

What is the most prototypical example of the shared relation?



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Task 2: Measuring Degrees of Relational Similarity

Given example pairs having approximately the same relation

Car:Antenna
Car:Hubcaps
Car:Seats
Car:Roof
Car:Wheel
Car:Engine
Car:Tires
Car:Windows

- 1 Identify what the relation is
- 2 Rate each pair according to the degree that it expresses that relation



Task 2: Measuring Degrees of Relational Similarity

bouquet:flower
army:soldiers
library:book
arsenal:weapons
herd:cow
troop:soldier
paragraph:word
album:photos
class:student
beach:sand
garden:plot

1 Identify what the relation is



Task 2: Measuring Degrees of Relational Similarity

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1 Identify what the relation is

A **X** is made from a collection of **Y**



Task 2: Measuring Degrees of Relational Similarity

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1 Identify what the relation is

A **X** is made from a collection of **Y**

2 Rate each pair according to the degree that it expresses that relation



Task 2: Measuring Degrees of Relational Similarity

- 51.7 bouquet:flower
- 50.0 army:soldiers
- 37.3 library:book
- 35.7 arsenal:weapons
- 23.6 herd:cow
- 21.1 troop:soldier
- 20.7 paragraph:word
- 18.2 album:photos
- 10.5 class:student
- 7.5 beach:sand
- 32.8 garden:plot

1 Identify what the relation is

A **X** is made from a collection of **Y**

2 Rate each pair according to the degree that it expresses that relation



Task 2: Relation Taxonomy

10 Relation Categories, Divided into 79 subcategories

Class Inclusion

Taxonomic - flower:tulip
Function - weapon:knife

Cause-Purpose

Cause:Effect - joke:laughter
Agent:Goal - climber:peak

Isaac I. Bejar, Roger Chaffin, and Susan Embretson.
Cognitive and Psychometric Analysis
of Analogical Problem Solving. 1991



Task 2: Relation Taxonomy

Includes some more challenging subcategories...

Similar

Dimensional Naughty - copy:plagiarize

Contrast

Asymmetric Contrary - hot:cool

Space-Time

Contiguity - ocean:coast



Task Data

- Lists of example pairs for all 79 subcategories
 - Pairs vary in quality
- Prototypicality ratings for 10 subcategories
- All materials used to crowdsource the ratings
 - Includes example description of each relation, “An X is a kind of Y”

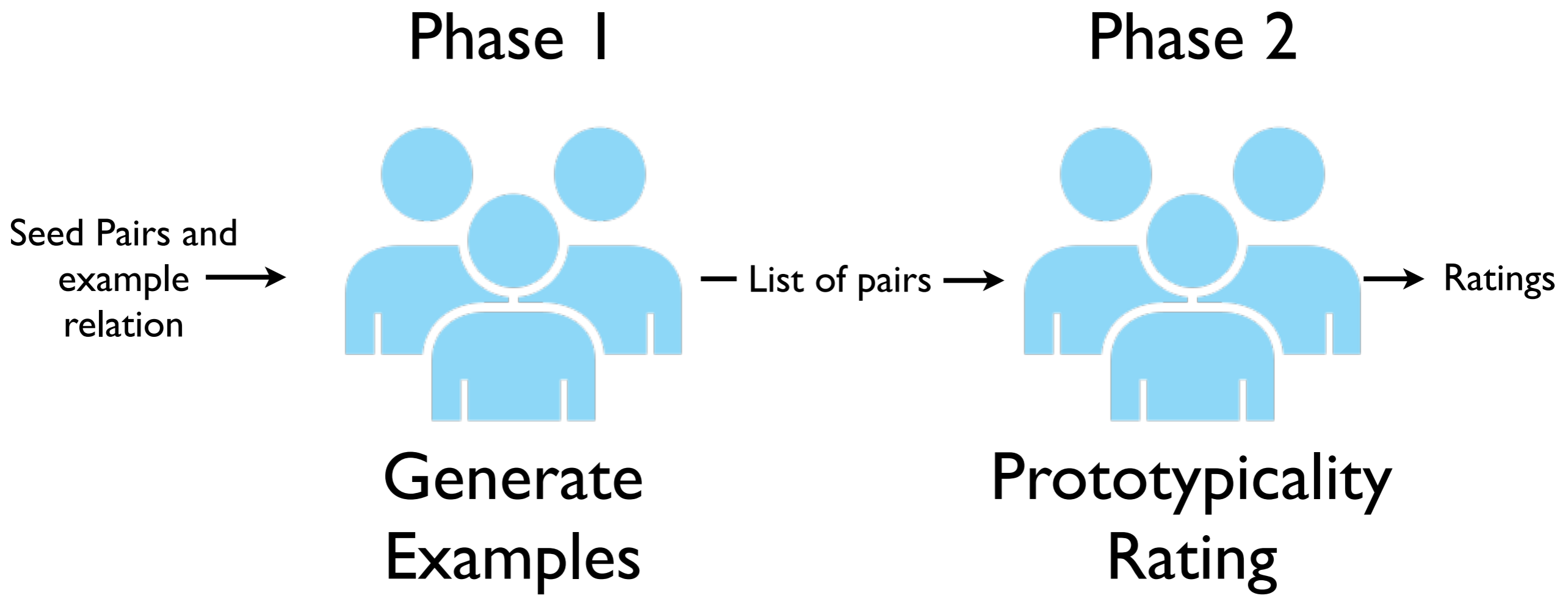


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Crowdsourcing Graded Relational Annotations





Gathering Relation Examples

- Question 1 asked Turkers to pick the relation shared by 3 seed pairs

Consider the following word pairs:

flower:tulip, emotion:rage, poem:sonnet

What relation best describes these X:Y word pairs?

to X is to have a Y receive some object/service/idea

Y is an unacceptable form of X

a Y is a part of an X

Y is a kind/type/instance of X

- Question 2 asked Turkers to provide four additional examples with the same relation



Rating Prototypicality

- Question 1 same as Phase 1
- Question 2 used the MaxDiff format

Given prototypical examples of a subcategory:

flower:tulip, emotion:rage, poem:sonnet

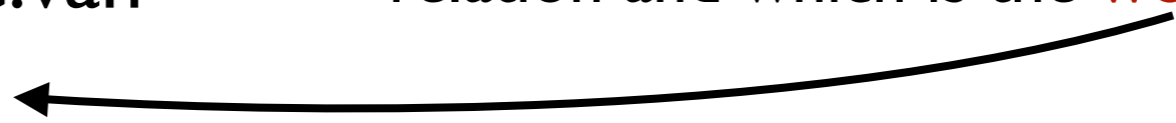
weapon:spear

bird:swan

automobile:van

hair:brown

Select which pair is the **best** example of the relation and which is the **worst** example





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Participants

- University of Texas, Dallas
 - two systems
- University of Minnesota, Duluth
 - three systems
- Benemérita Universidad Autónoma de Puebla (México)



Evaluation Metrics

Systems provide numerical ratings for each pair

- Use the ratings to answer MaxDiff questions

weapon:spear
bird:swan
automobile:van
hair:brown



Highest scoring
is best example

- Compare system ranking with Turker ranking using Spearman's rank correlation

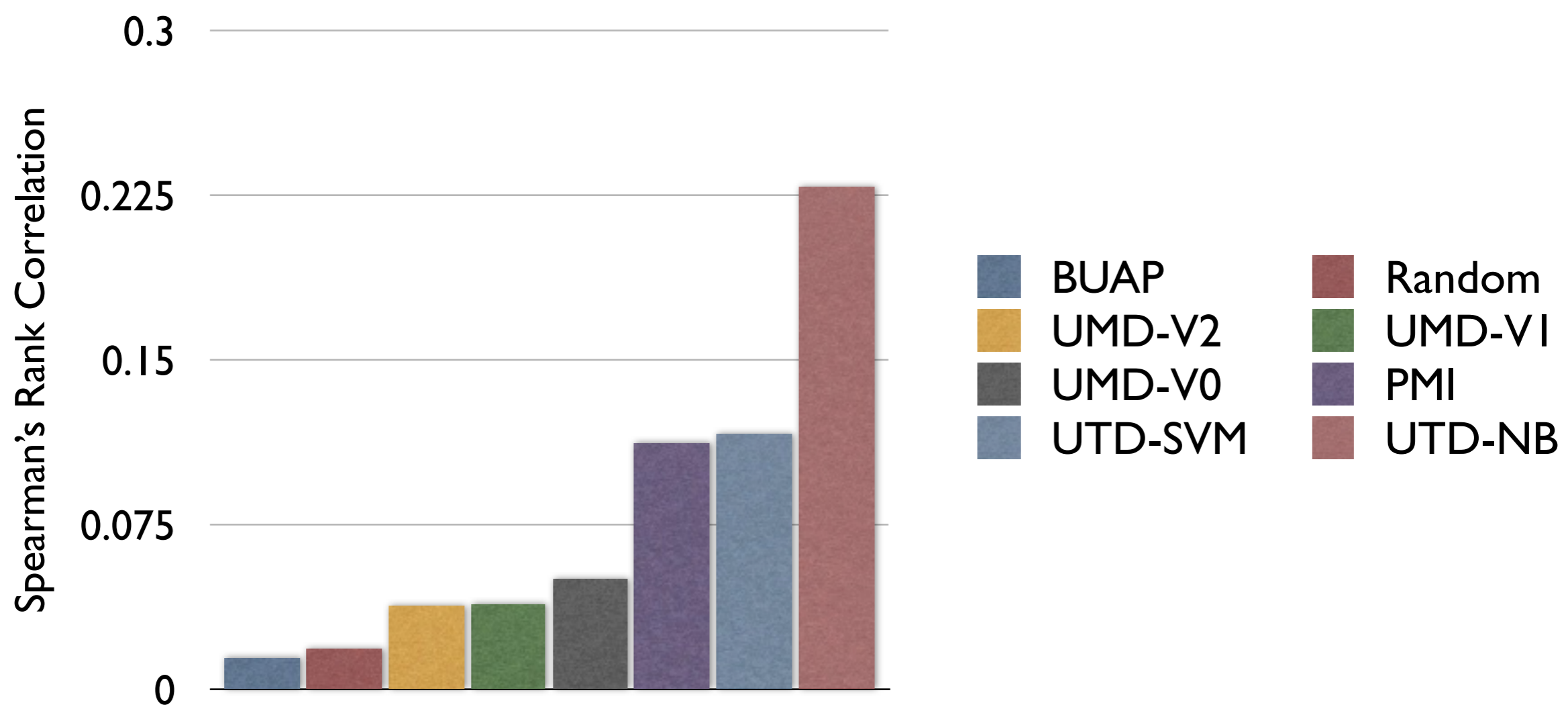


Baselines

- Generate a random ordering of pairs
- Score pairs according to the pair's words' Point-wise Mutual Information (PMI)
 - a measure of statistical association of the pairs' words



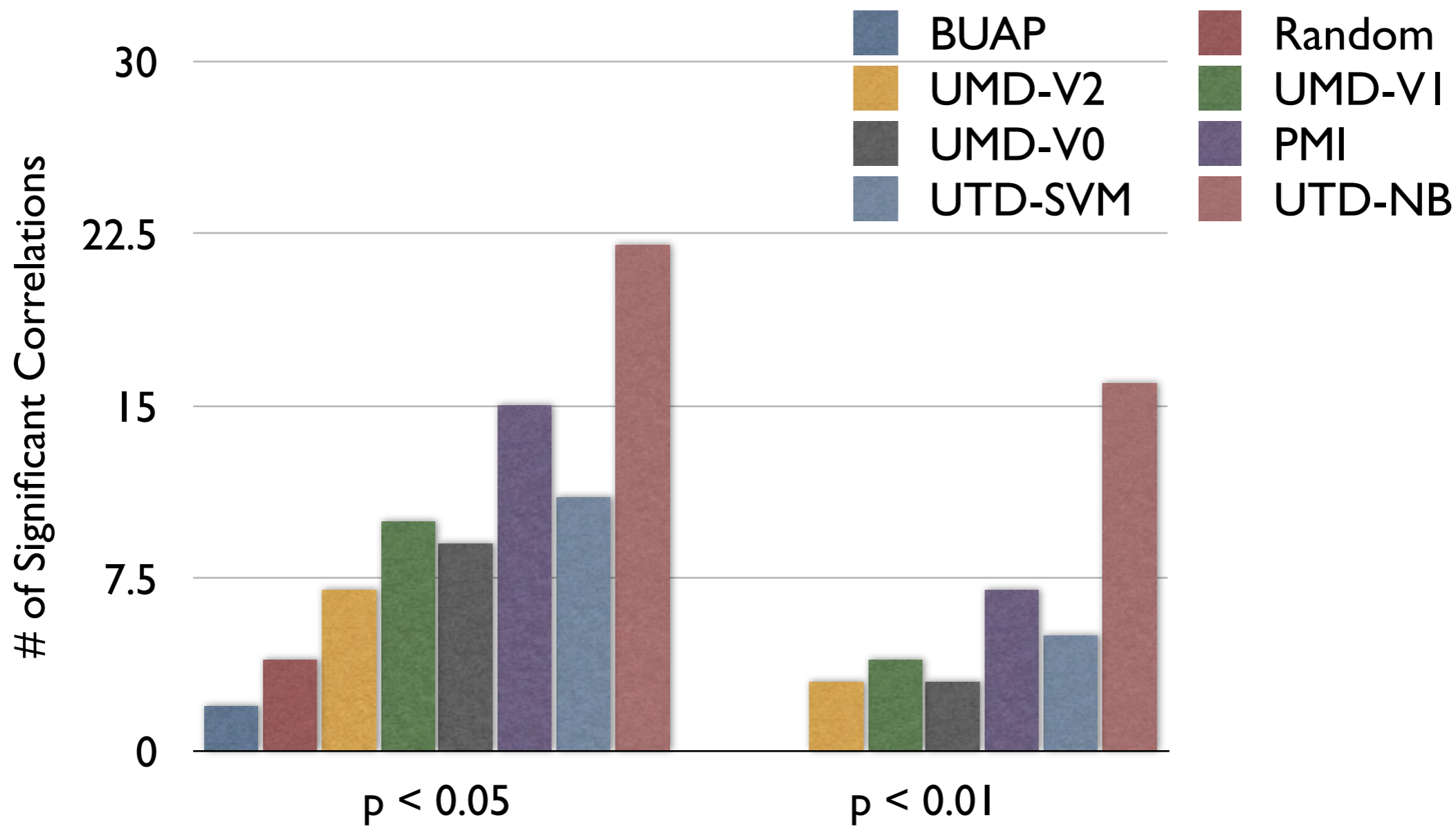
Average Correlation Performance





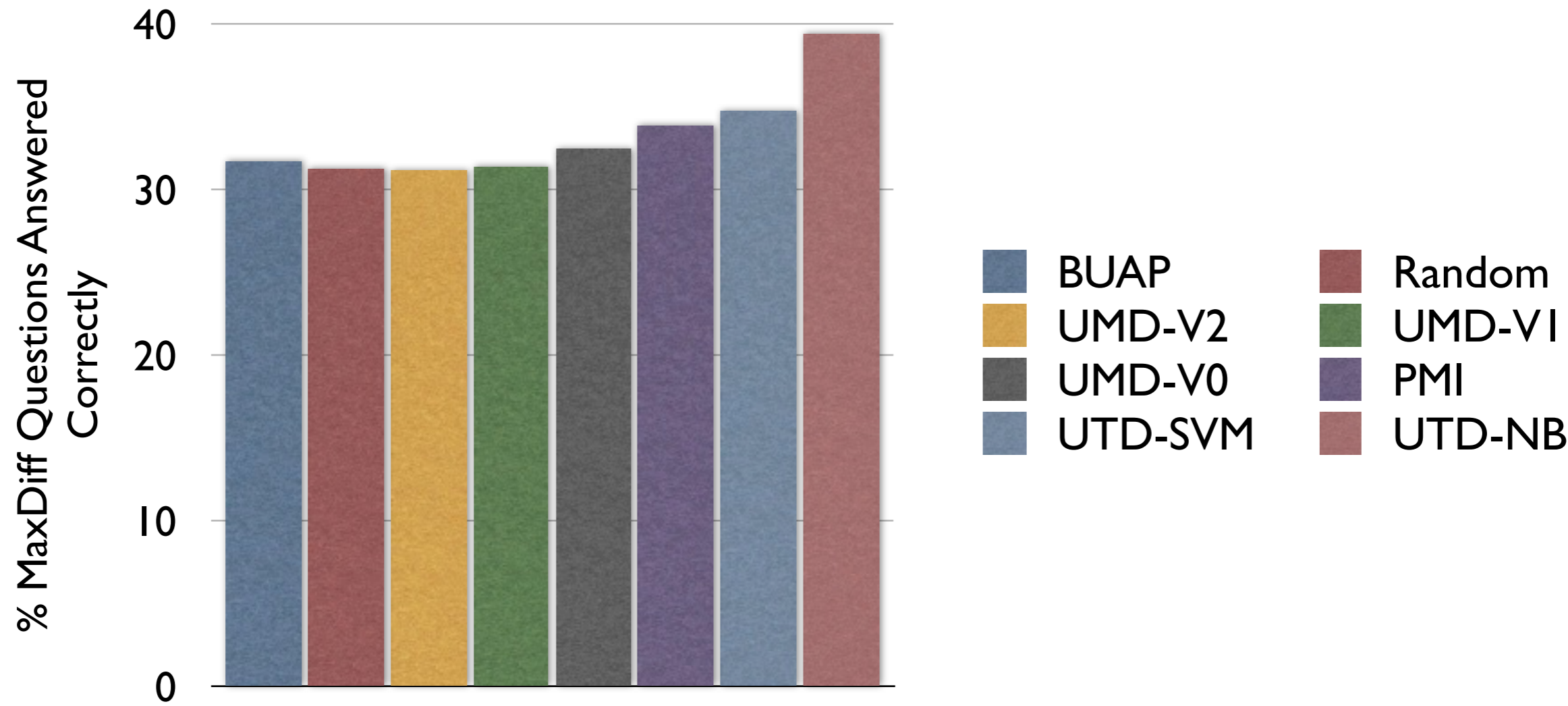
Correlation

Performance per Subcategory





MaxDiff Performance





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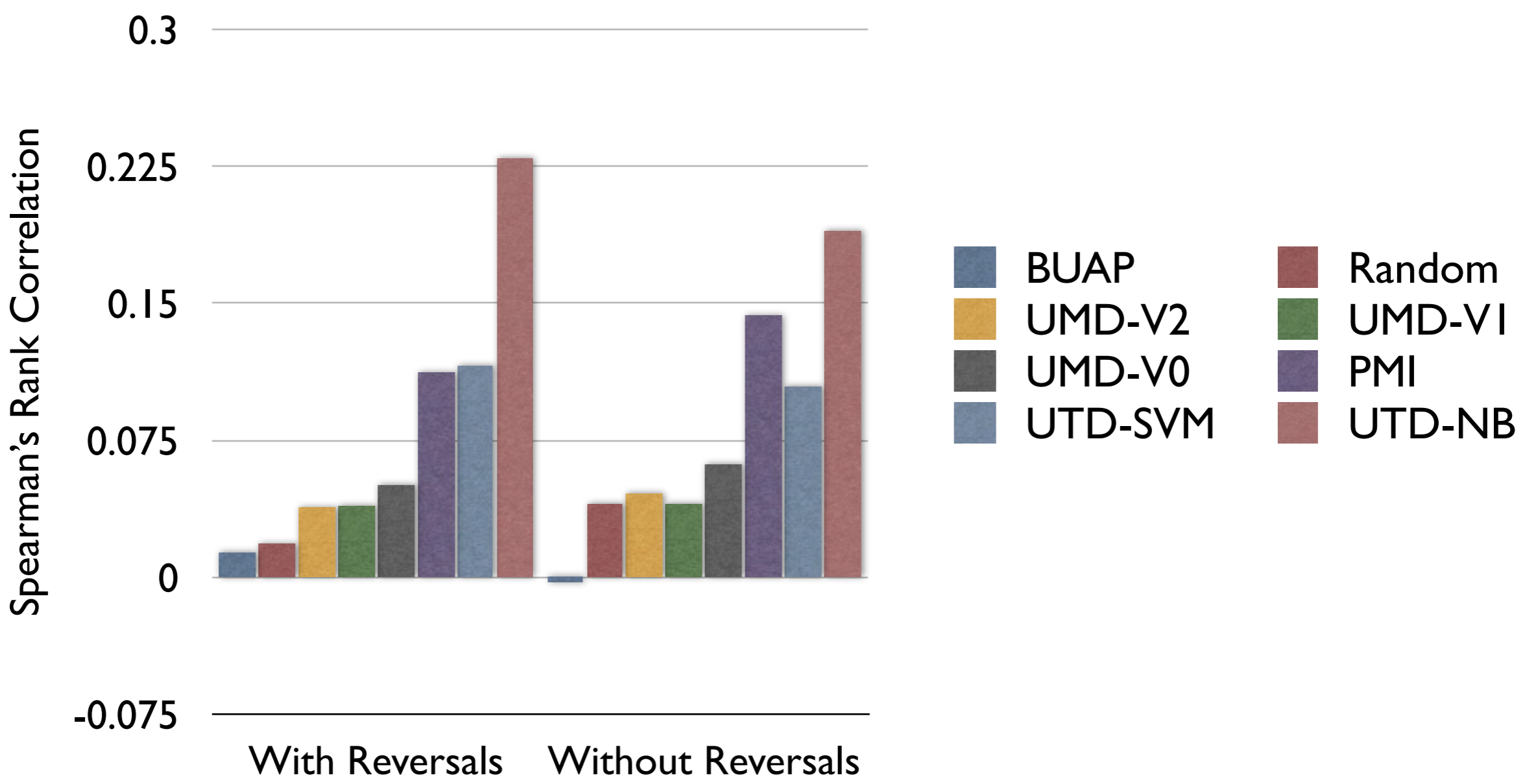


Categorical Performance

- Were some subcategories harder than others?



Measuring the impact of pair reversals





Future Work

- Relations aren't simply binary
 - Especially when relational reasoning comes into play
- Future SemEval task
- Dataset has many uses in psychology as well as computational linguistics
- Spark more interest



Thank you!

<https://sites.google.com/site/semEval2012task2/>

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