REUTERS / Dominic Ebenbichler

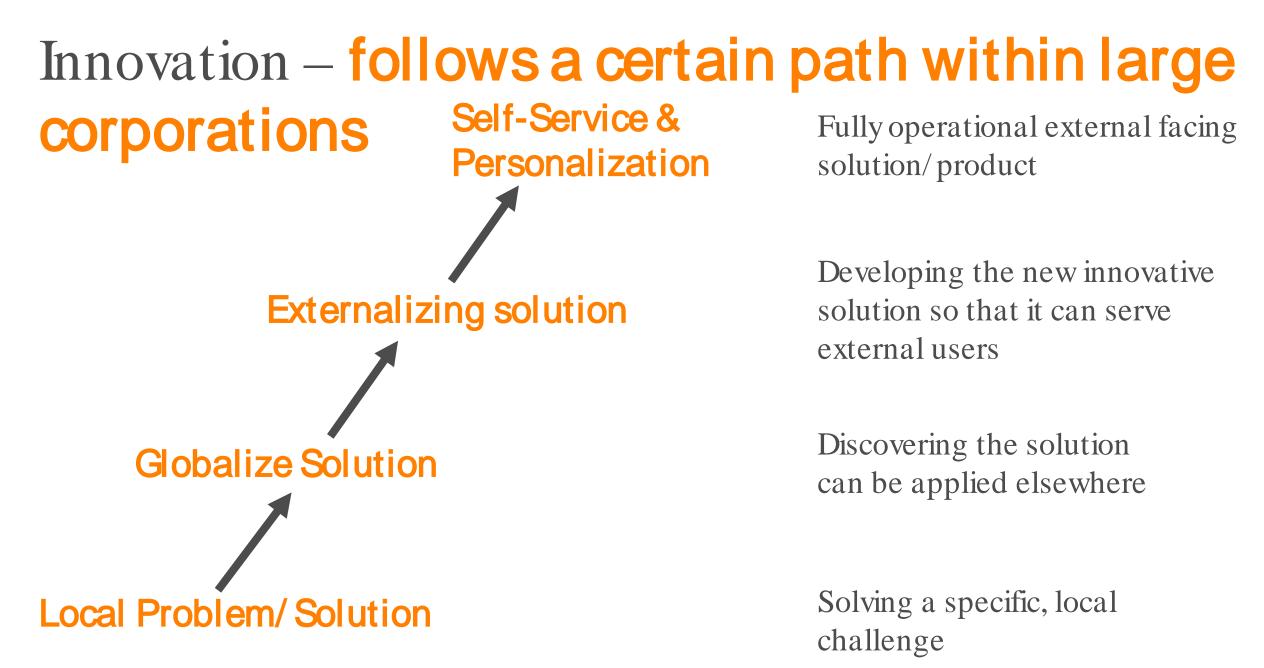
THOMSON REUTERS BOLD Quantitative Finance @WORK

Douglas McKinley Tor Vergata Rome 04/05/2018



How does innovation start?







(big) Data is an example



Standard challenges with (big)data... **1.Extraction** 2.Connection **3.Navigation**



Data Data Everywhere - the key is to link the data

"Any [Chief Data Officer] really ought to be able to ask a question that involves connecting data across the organization, be able to run an [enterprise] effectively, and especially to be able to respond to unexpected events. <u>Most</u> organizations are missing this ability to connect all the data together."

Sir Tim Berners-Lee, The investor of the World Wide Web and one of Time Magazine's 100 Mc Important People of the 20th Century



Exploit signals in News

News flow and sentiment are important sources of signals in quantitative stock selection and systematic trading.
However news and social media data is <u>unstructured</u> and <u>there is a lot of it</u>. Is it <u>positive</u> or <u>negative</u>? New, old or recycled? <u>Relevant</u> to a company?

500,000 text news stories per day 7,000+ Text News Sources 540,000 video clips and growing 80+ video sources 1,600 pictures per day 34 languages



Unstructured to Structured - News Analytics

Output

												FUSILIVE					
					q	0						Sentiment				_	
News Item Id	Regio	onal Timestamp	Со	PermID	Attrib	ltem Type			ŀ	Headline			Rel	Sent	Pos	Neut	Neg
CCN34MqtG_16101	9 2016-10)-19T01:05:21.044Z	TCKb.TO	4295861257	MKW	ARTICLE	Teck to Acqui	re 100% of Tee	ena/Reward Zin	c Project <tck< td=""><td>b.TO></td><td></td><td></td><td></td><td>0.70 0</td><td>.18 <mark>0</mark></td><td>.11</td></tck<>	b.TO>				0.70 0	.18 <mark>0</mark>	.11
FWN1CO0CV_1610	01 2016-10)-19T07:13:03.655Z	WFC.N	8589934175	RTRS	ALERT	WELLS FARC	GO & CO <wf< td=""><td>C.N> :FBR CU</td><td>ITS TO MARKE</td><td>T PERFORM FF</td><td>ROM OUTPERFO</td><td>RM 1.00</td><td>-1</td><td>0.06 0</td><td>.13 <mark>0</mark></td><td>.82</td></wf<>	C.N> :FBR CU	ITS TO MARKE	T PERFORM FF	ROM OUTPERFO	RM 1.00	-1	0.06 0	.13 <mark>0</mark>	.82
FWN1CP0EI_16101	19 2016-10)-19T09:46:23.203Z	TWTR.N	4296301199	RTRS	ALERT	TWITTER INC	<twtr.n> : L</twtr.n>	OOP CAPITAI	L RAISES TO H	HOLD FROM SE	LL - THEFLY.COM	/ < 1.00	1	0.60 0	.32 0	.09
ZHN0BUV0T_16101	9 2016-10)-19T19:45:00.828Z	AVP.N	4295903496	RTRS	ARTICLE	NYSE ORDER	R IMBALANCE	<avp.n> 205</avp.n>	700.0 SHARES	S ON SELL SIDE	<avp.n></avp.n>	0.50	0	0.18 0	.59 <mark>0</mark>	.23
L8N1D96VH_16110	9:2016-11	I-09T04:50:11.802Z	VLLP.PA	Stock Re	eport		French and B	enelux stocks-l	Factors to wate	ch on Nov. 9 <c< td=""><td>NAT.PA><edf.i< td=""><td>PA><vllp.pa></vllp.pa></td><td>0.24</td><td>-1</td><td>0.07 0</td><td>14 0</td><td>79</td></edf.i<></td></c<>	NAT.PA> <edf.i< td=""><td>PA><vllp.pa></vllp.pa></td><td>0.24</td><td>-1</td><td>0.07 0</td><td>14 0</td><td>79</td></edf.i<>	PA> <vllp.pa></vllp.pa>	0.24	-1	0.07 0	14 0	79
L4N1DA09T_161109	92 2016-11	I-09T08:50:57.806Z	RIO.AX	4290800917	KIKO	ARTICLE	BREAKINGVI	EWS-Rio Tinto	trips into bribe	ery mine shaft i	n Africa <rio.ax< td=""><td>><r< td=""><td>ory up</td><td>date</td><td>d 89</td><td>mins</td><td>5</td></r<></td></rio.ax<>	> <r< td=""><td>ory up</td><td>date</td><td>d 89</td><td>mins</td><td>5</td></r<>	ory up	date	d 89	mins	5
L4N1DA09T_161109	92 2016-11	I-09T10:09:30.182Z	RIO.AX	4295856917	RTRS	ARTICLE	BREAKINGVI	EWS-Rio Tinto	trips into bribe	ery mine shaft i	n Africa <rio.ax< td=""><td></td><td>ter pre</td><td></td><td></td><td></td><td></td></rio.ax<>		ter pre				
L8N1D95GR_16110	9 2016-11	I-09T17:55:19.976Z	GS.N	4295911963	RTRS	ARTICLE	EXCLUSIVE-C	Goldman Sachs	s considers Fra	ankfurt move ove	er Brexit - source				0. T T U		
FWN1DA0JB_16110	0(2016-11	I-09T23:28:01.245Z	CTS.N	4295903630	RTRS	ALERT	CTS CORP <	CTS.N>: B. RIL	EY STARTS V	VITH BUY; TAF	RGET PRICE \$22	CTS N>	1.00	1	0.55 0	.44 0	.01
IFR20h64D_161116	2 2016-11	I-16T01:44:11.485Z	SGXL.SI	4298007743	IFR	ARTICLE	UPDATE: Ric	kmers misses	coupon payme	ent, suspends t	Low Releva	ance	0.20	-1	0.06 0	.13 <mark>0</mark>	.82
FWN1DG129_1611	1(2016-11	I-16T06:07:49.218Z	CRDI.MI	4295875726	RTRS	ALERT	UNICREDIT S	PA <crdi.mi></crdi.mi>	: HSBC RAISE	ES TARGET PH	NUE 10 2.00 EU	יגט <mark>ס ר</mark> גט <mark>M 2.83</mark>	∠U 1.00	1	0.56 0	.43 0	.01
L8N1DH37L_161116	62 2016-11	I-16T11:32:23.557Z	RDSa.L	4295885039	RTRS	ARTICLE	BUZZ-Shell ar	nnounces nearly	y 400 job cuts	in Scotland <ri< td=""><td>DSa.L></td><td></td><td>1.00</td><td>-1</td><td>0.06 0</td><td>.13 <mark>0</mark></td><td>.82</td></ri<>	DSa.L>		1.00	-1	0.06 0	.13 <mark>0</mark>	.82
FWN1DH0M5_1611	1 2016-11	I-16T15:03:11.091Z	NDAQ.O	8589934167	RTRS	ALERT	NASDAQ HAI	LTS DRYSHIPS	SINC. <ndaq.< td=""><td>0></td><td></td><td></td><td>1.00</td><td>0</td><td>0.18 0</td><td>.81</td><td></td></ndaq.<>	0>			1.00	0	0.18 0	.81	
د د د د د د د د د د	su	UNICREDIT	SPA <cr< td=""><td>RDI.MI>: H</td><td>SBC F</td><td>RAISES</td><td>TARGET P</td><td>RICE TO 2.8</td><td>85 EUROS</td><td>FROM 2.83</td><td>EUROS; RAT</td><td>TING BUY<cf< td=""><td>DI.MI></td><td></td><td></td><td></td><td>F</td></cf<></td></cr<>	RDI.MI>: H	SBC F	RAISES	TARGET P	RICE TO 2.8	85 EUROS	FROM 2.83	EUROS; RAT	TING BUY <cf< td=""><td>DI.MI></td><td></td><td></td><td></td><td>F</td></cf<>	DI.MI>				F
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Strong Positive

1st Me	Tot Se	# of C	# Sent Wds/T	Tot Wds/T	Volume Count	Novelty Count	Exchange Action	Broker Action	Price Target	Market Commentary	Topic Codes	Negative Sentiment
	1 2	21 1	430	490	1 1 15 25 33	00000	UNDEFINED	UNDEFINED	UNDEFINED	FALSE	AMERS BMAT CA CMPNY MEMI MIN MINE MTAL NAMER NEWR	
	1	1 1	13	13	30 50 81 202 261	0 0 8 20 25	UNDEFINED	DOWNGRADE	UNDEFINED	FALSE	AMERS BANK BISV BLR BSVC CMPNY FINS INVM INVS NAMER RCH US	S WLTH
	1	1 1	13	13	2 3 7 22 39	00000	UNDEFINED	UPGRADE	UNDEFINED	FALSE	AMERS BLR CMPNY ITSE NAMER RCH SWIT TECH TMT US	
	0	2 1	17	17	00000	00000	IMBALANCE	UNDEFINED	UNDEFINED	FALSE	AGA AMERS CMPNY NAMER NOVO PEPS PPRO US	
	74	19 3	36	289	38888	00000	UNDEFINED	UNDEFINED	UNDEFINED	TRUE	Market Commentary EUROP EZC FINS FR INVD INVS NL	OILQ REP S
	1 4	2 2	859	912	22 24 38 40 42	22222	N	lovelty Coun	t EFINED	FALSE	AFR AMERS ANV ASIA ASXPAC AU AUNZ BACT BASMTL BMAT BR BRI	B BRV BRVF
	1 4	3 2	871	924	15 23 39 41 43	33333	lr	ncrease	EFINED	FALSE	AFR AMERS ANV ASIA ASXPAC AU AUNZ BACT BASMTL BMAT BR BRI	B BRV BRVF
	1 3	34 1	858	909	11 12 32 33 59	22222	UNDEFINED	UNDEFINED	UNDEFINED	FALSE	AMERS BACT BANK BISV BRXT BSVC CEEU CEN CLJ CMPNY DE DIP E	CB EU EURC
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	8 1	3 1	72	238	1 2 5 6 18	00000	UNDEFINED	UNDEFINED	UNDEFINED	FALSE	ASEAN ASIA ASXPAC BACT BISV CDM CMPNY CORPD DBT DBTR EMR	G EUB EXCA
		2 1	17	17	1 15 56 85 113	01244	UNDEFINED	MAINTAIN	INCREASE	FALSE	BANK BISV BLR BSVC CMPNY EUROP EZC FINS IT RCH WEU	
		3 1	108	108	5 19 41 49 73	00000	UNDEFINED	UI NED	UN NED	FALSE	BACT BISV CMPNY COM ENER EUROP FINS GB GBS JOB LAYOFS NRG	G OILG REAL
		1 1	5	5	00000	00000	HALT	רי – 10	. NED	FALSE	AMERS BISV BLR CMPNY EXCA FINS INVS NAMER US	

Company

mentioned in second half of the story

Broker Action w/ Price Target in different direction



BOLD Solutions

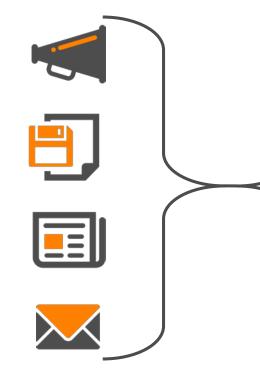
Big Open Linked Data Solutions is a range of data integration, structured and unstructured data management tools and a powerful set of analytical tools built upon the Thomson Reuters' expertise and foundation technologies in content management.



Intelligent Tagging – Structuring the Unstructured

Unstructured Content

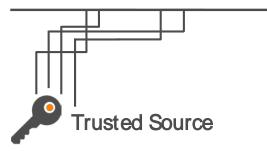
Content uploaded from news articles, blog postings, proprietary data, catalogs, social media, and more.





Structured Metadata

Our unique identifiers leverage the deep knowledge in Thomson Reuters professional data, creating metadata to enrich your own content – and also mapping it to Thomson Reuters content to give the best of both worlds.



The Thomson Reuters key advantage is assigning unique identifiers, or PermIDs, which go beyond keywords, returning the right connections you'd otherwise miss.



PermID – A Barcode for Information



Instrument TR Ord Shares PermID: 85909928696





Geography Canada PermID: 100052



Primary Ticker – TRI Primary Exchange – TSX Primary RIC – TRLTO PermID: 55838860337



Organization Thomson Reuters Corp PermID: 4295861160

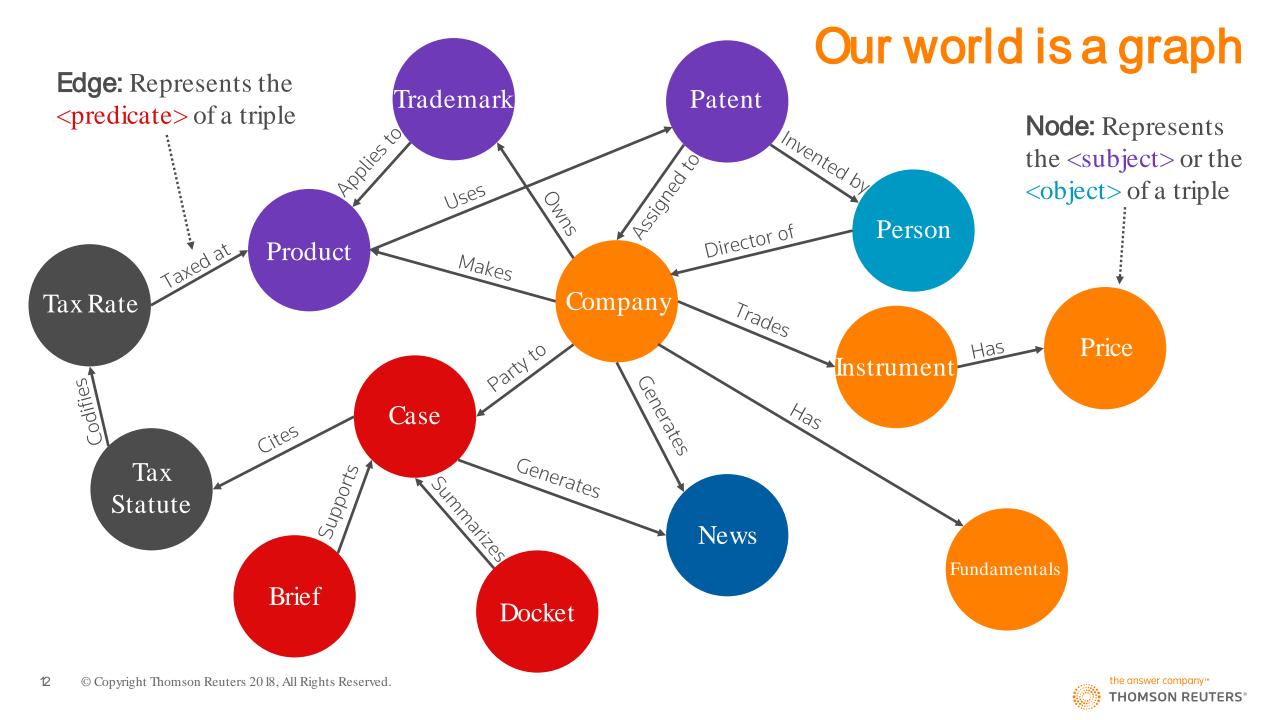
Unique

Permanent

Key identifier

TR Industry Classification Professional Information Services (NEC) PermID: 4294951759





Knowledge Graphs – Famous Examples

Building The LinkedIn Knowledge Graph

LinkedIn's knowledge graph is a large knowledge base built upon "entities" on LinkedIn, such as members, **jobs**, **titles**, **skills**, **companies**, **geographical locations**, **schools**, etc.

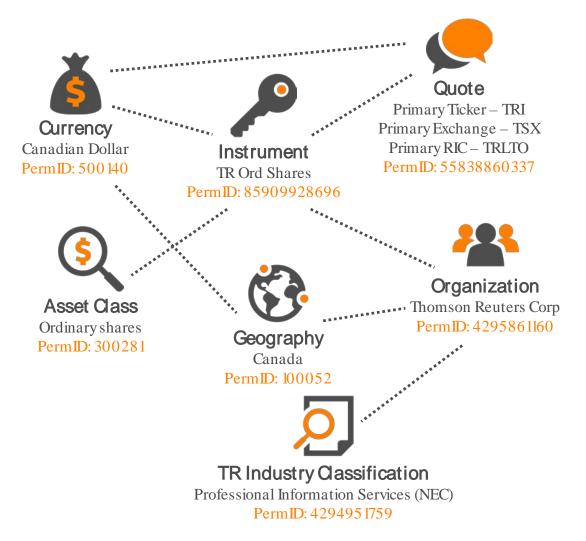
These entities and the relationships among them form the <u>Ontology</u> of the professional world as LinkedIn see its

Used in its **recommender** systems, search, monetization and consumer products, and business and consumer analytics.





TR Knowledge Graph – A Wealth of Knowledge



Connect the dots

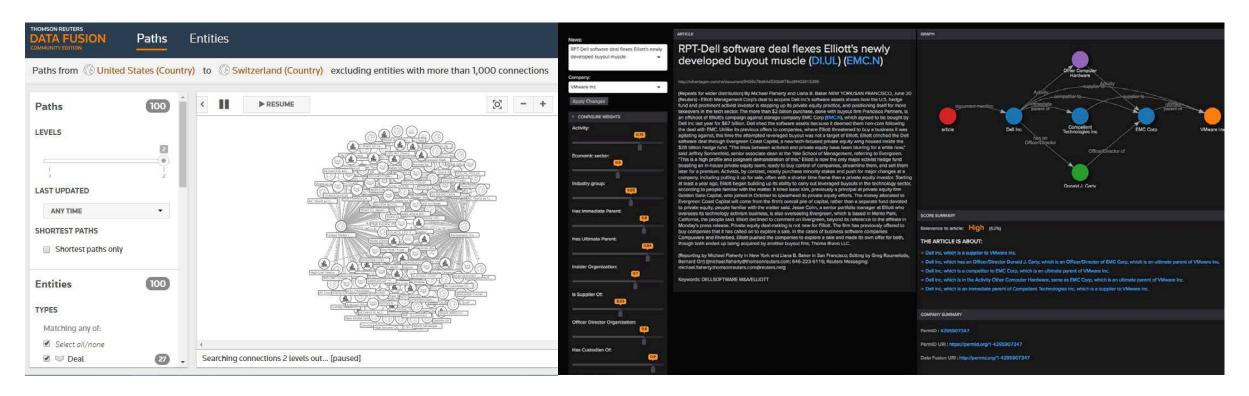
- Capturing relationships and entities from TRIT and Thomson Reuters Data
- Aggregating facts about entities over time
- Rely on a rich and standardized ontology of information





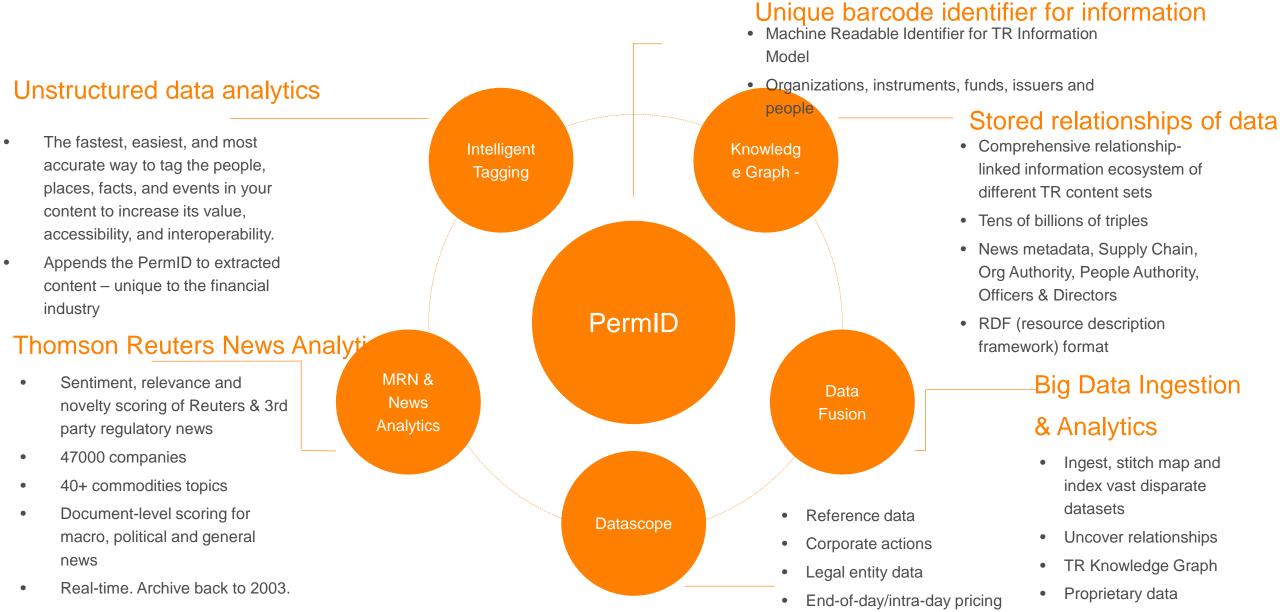
TR Data Fusion – Graph Analytics

- Data Fusion integrates the Knowledge Graph with your data, allowing you to visualize and explore relationships
- Graphs can grow very quickly and become unreadable
- We have developed tools to to filter out the noise based on a relevance score





Extract signal & insights - From unstructured content noise



the answer company™ THOMSON REUTERS®

Evaluated pricing services

Use the (free) PermID demo PermID.org



Grazie! Domande?

S didmckinley www.linkedin.com/in/douglasmckinley

