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Ted and Karyn **Hume Center** for National Security and Technology & **SEEC Center**: Synergistic Environments for Experimental Computing

# Building a General Search Engine for Unstructured Data

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Electronic Warfare



Resilient Systems



Data to Decision

# Why Build a Search Engine?

- Lots of data that isn't currently searchable because there is no metadata associated with it
  - image, (noisy) audio, video, communications, IoT
- Multi-INT Big Data -- The majority of unstructured data is "not" text
  - 88% Image/Video, 10% Audio/Communications, 2% Text
  - Video consumes ~75% of Internet bandwidth today (~85 90% 2018, Cisco)
- Help analysts/users find the information they want (actually, we provide pointers to information):
  - Google search for any type of digital data
- Multi-Sensor data fusion
- Making use of the structure of data (i.e., galaxy plots)
- Search for people, places, and things including their interactions (i.e., graphs)

# Search Engine Technology

- Algorithms and Data Management:
  - Ingest: Unstructured data, compressed. Parallel I/O
  - Signature generation: Transform unstructured data into signatures
  - Signature comparison: Pairwise comparison of "unknown" signature with "known" signatures (database)
  - Connecting signatures into graphs
  - Results and Metrics: Not designed to be 100% accurate, but uses high probabilities
  - User Interfaces and user interaction
- Optimization:
  - Algorithms
  - Hardware and Code Performance
  - Usability
- Hybrid, Heterogeneous Parallel Computing
  - MPI, Hadoop/MapReduce
  - OpenMP, Cuda, OpenCL

# Searching for Objects in Image/Video

# Two typical frames from cell phone videos





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⇐ Search for these objects, called "search criteria".
Wu, Hao, Kaixi, purple frisbee, building



### Search for a building/place: http://198.82.148.84/datafission/results/synergy\_building/html\_search/



#### Search for the Purple Frisbee: http://198.82.148.84/datafission/results/synergy\_frisbee/html\_search/



# Google Image .vs Bing Image vs. VT Search Engine



# **Google Image Search vs. VT Search Engine**

Search Query	Bing Image Search
Google Image Search	We couldn't find any matches for this image. Search tips: • Please use a valid image file. The image can be a .gif, .jpg, .bmp or .png file type. • The image must be 10MB or smaller.
54 × 80 °°°         No other sizes of this image found.         Tip: Try entering a descriptive word in the search box.         Visually similar images         Report images	VT Search Table of top search frame results: 50

# Compound Search (i.e., more than one search criteria)

Search Query



# Google Image Search: (Google doesn't support multiple image search criteria)

Google	Als_right_eye	e.JPG × d	escribe ima	ige here			0	Ŷ	۹
	Web Images	News	Shopping	Maps	More -	Search tools			
	Image si 44 × 30 No other	ze: • sizes of this i	mage found.						
	Tip: Try entering	a descriptiv	ve word in t	he search	box.				
	Visually similar	· images				Report images			
						-			
			e	avr		area da			

# (compound) VT Search Search Analyze Results: Source: /lustre/www-data/mediaData/processedData/Al/Als left eye.JPG/Als left eye.JPG /lustre/www-data/mediaData/processedData/Al/Als\_nose.JPG/Als\_nose.JPG /lustre/www-data/mediaData/processedData/Al/Als\_right\_eye.JPG/Als\_right\_eye.JPG Targets: /lustre/www-data/mediaData/processedData/Al/AlZahari.mp4/AlZahari.mp4 Table of top search frame results: 50





Rank 1 & 2

Search for RB #22 "and" the football





Rank 3 & 4



Rank 9 & 11



Rank 15 & 16



3 **OOIs** 









DTV ULTN

AP. LAP

BLK

AUTO OK

La el ser la ella el

("and" operator)

TOC

## (Compase Clip 7 Red Car.mpeg)

36 35 24 7212 BLK

313H

same scene at the same time?

("and" operator)

Source: /lustre/www-data/video11/sun /White\_Dodge\_Pickup\_Parked.JPG

Target: /lustre/www-data/video11/sum /./slave video default/pc.001.000017/fi



AUTO OF

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AUTO OK

1616 RD

> /White Dodge Pick /White Dodge Pick /White Dodge Picka source: /lustre/wy

SAD: 000.76 /White Dodge Pic /White Dodge Pick /White Dodge Pic source: /lustre/ww



/White Dodge Pic /White Dodge Pic /White Dodge Pic



source: /lustre/www /White Dodge Pick /White Dodge Pick /White Dodge Picl

source: /lustre/wv /White Dodge Pick /White Dodge Picl

Search for 3 cars using Boolean "and" /"or" operators







Pattern-of-Life: Have three vehicles ever been in the



AUTO OF



27NH-



1.1.1

-16>





Rank: 4 SAD: 000.84 SAD: 001.04



/White Dodge Pick

source: /lustre/www /White Dodge Pick /White Dodge Pick

/White\_Dodge\_Picl

/White Dodge Pic /White Dodge Pic /White Dodge Picl source: /lustre/ww /White Dodge Pic /White Dodge Pick



172/290 ΑĒ. LAP RUK

10-10

LIO OK

# **Logo Search**



## State Farm Logo:



## Search for the StateFarm logo in a set of 2012 and 2013 basketball highlight videos

## Search Results:

Table of top search frame results: 50



Table of top search OOI results: 50

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- State Farm
StateForm StateForm StateForm
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StateForm









# **Data ==> Signatures ==> Database ==> Search Engine**



# Signatures: Quantitative Information Representation What do signatures look like?



Signature Dope Vector: 151 80 V:20#E:20#S:20#F:20# 66.45 57.47 0.65 2.43 4.02 91.99 91.18 0.69 1.98 2.59 55.02 51.40 1.02 3.72 9.03 53.25 50.39 1.20 4.27 11.36 36.75 61.83 3.07 11.04 38.90 59.85 99.02 1.37 2.93 5.45 40.77 77.17 2.37 6.77 18.72 40.97 80.35 2.27 6.21 16.47 17.53 31.36 3.02 12.97 58.86 18.58 33.76 3.04 13.26 61.06 17.10 31.50 3.05 13.15 60.22 17.81 30.44 2.92 12.50 57.12 40.80 32.62 0.05 1.21 0.14 107.12 111.46 0.13 1.10 0.35 16.22 25.14 2.02 8.35 40.13 0.02 1.77 63.62 4052.87 258199.4 2

## Signatures: Why these components? Necessary/Sufficient?



Statistics: If two signatures are going to match, then the statistical moments "necessarily" have to be similar.

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**Entropy:** Entropy of man-made vs. natural objects is a discriminator. Natural objects tend to have higher entropy. Man made objects tend to have lower entropy because of (unnatural) uniformity.

**Spatial frequencies:** Edges, curvature, corners are important discriminators for the human vision system.

Spectral frequency: Used as a e discriminator, even though the audible frequency distribution may not mean anything to a human or DSP algorithm.

## **Signatures: Computational Kernels**



**Kernel 1:** Mean **Kernel 2:** Generating function for variance, skew, kurtosis, hyper-skew

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**Kernel 3:** Histogram and Histogram to P() normalization **Kernel 4:** P()log(P()) **Kernel 5:** Difference-of-Laplacians (DoL) edge detection filter. 5-Point / 9-Point Stencil Kernel 6: 1-D FFT

# Youtube Videos: Media Space vs. Search Space





## **Exploiting the Structured of Data**



## Visualization of Data: classification, clustering, graph analysis, summarization/search results





IMSI Blacklist: 10 310 IMSI Blacklist: 10 404 IMSI Blacklist: 10 460

Area Code Blacklist: 10 540 Area Code Blacklist: 10 402 Area Code Blacklist: 10 509

AC dict entry: 402 31890 402 P Lincoln\_and\_Omaha\_Nebraska AC dict entry: 509 31830 509 P Pullman\_Spokane\_and\_Walla\_Walla\_Washington AC dict entry: 540 31020 540 E Fredericksburg\_Roanoke\_and\_Winchester\_Virginia

IMSI dict entry: 310 44810 310 390 us United\_States 1 Yorkville\_Telephone\_Cooperative IMSI dict entry: 404 44380 404 30 in India\_91\_Usha\_Martin\_Telecom IMSI dict entry: 460 44650 460 01 cn China 86 China\_Unicom



# **D-Wave Adiabatic Quantum Computer**

- Computes all results at once, reads out one
- Solutions in about 100msec
- Crudely similar to simulated annealing
- Express problem as a QUBO (Quadratic Unconstrained Binary Optimization)
- Transformed into a QMI (Quantum Machine Instruction)
- Results read out as a binary bit vector
- Application areas:
  - Shor's Algorithm (exponential speedups)
    - Prime number factorization
  - Grover's Algorithm (SQRT(N) speedup)
    - Unstructured search
- Application areas:
  - Traveling salesman problem
  - Knapsack problem
  - Machine learning







# D-Wave ToQ source code example

### Simple program (sample.toq)

- # --- sample.toq --- Regression test
- #
- bool: @a, @b
- bool: @c, @d
- #~~~
- assert : And( Or(@a,@b), Or(@c,@d) )
- assert: @c != @d
- assert: (@a+@d >= (@b+@c))
- #~~~
- end:



# --- sample2.toq --- Regression test bool: @a, @b bool: @c, @d real: x, y, z #~~~ x = pi y = sqrt(x+2)z = x-y assert: And(Or(@a,@b),Or(@c,@d)) if: ((z\*x)/3 > 3.11) assert: @c != @d endif: assert: (@a+@d >= (@b+@c)) #~~~ printvars: end:

#### sample2.toq

#### sample2.toq (results)

		4	Res (47	ults 1 oc	(40 curr	0 cases) ences)
*	Variable Name					
1)	@a	1	1	0	1	
2)	@b	0	0	1	0	
3)	@c	0	1	0	1	
4)	@d	1	0	1	1	
0cc	urrences'	340	89	41	1	
						<pre>' Enter "toq -QM" for an explanation of why (Sum(Occurrences) != cases)</pre>

# **Unstructured Search on the** D-Wave Adiabatic Quantum Computer

 Relax a surface onto the surface of "unknown" signatures minus "database" signatures





## Virginia Tech Search Engine (VTSE) Platform Architecture

