

Creation of an Evaluation Paradigm for "RecordMatch" and its Application to GenMergeDB Clustering Results

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OUTLINE

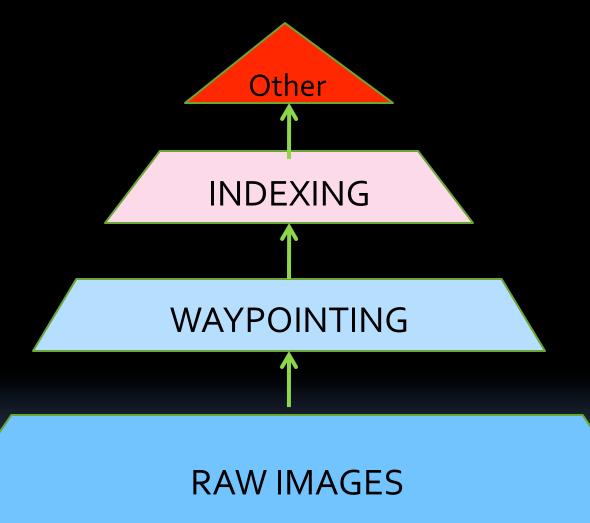
- BACKGROUND ON "RECORD MATCH"
- STRATEGY FOR EVALUATION
- SCORING & RESULTS
- CONCLUSIONS



BACKGROUND ON "RECORD MATCH"



Data: Raw+Annotation





An "Indexed" Record

"Indexing" or "Extracting" renders the information in a record as text.

		rry Rober	
	esidence. No. 96 Usual place of abode of residence in city or town		
	SONAL AND STATE		
3 SEX		1 5 Sindle M	arried, Widowed
Ma.l	e White	Sing	le
HU	narried, widowed or divore SBAND OF WIFE OF	ed	
6 DAT	e of BIRTH June Month	30, Day	1.926 Year
7 AGE	Years Mont	bs Days	If LESS than 1 dayhrs. ormin.
b. Ger busine which	de, profession, or lar kind of work beral nature of industry, s, or establishment in employed (or employer) ne of employer	None	
	THPLACE city or town.	Salt Lak	ce City, Utah
	10 NAME OF FATHER HE	arry Cran	ne
STN	11 BIRTHPLACE		City, Uta
PARENTS	12 MAIDEN NAME		Thurgood
	13 BIRTHPLACE	alt Lake	

Full Name: Harry Robert Crane

(a) Residence No. 968 Blaine Avenue

Sex: Male, ...

Date of Birth: June 30, 1926

Age: 1m 11d

Birthplace: Salt Lake City, Utah

Name of Father: Harry Crane

Bplace of Father: Salt Lake City, Utah

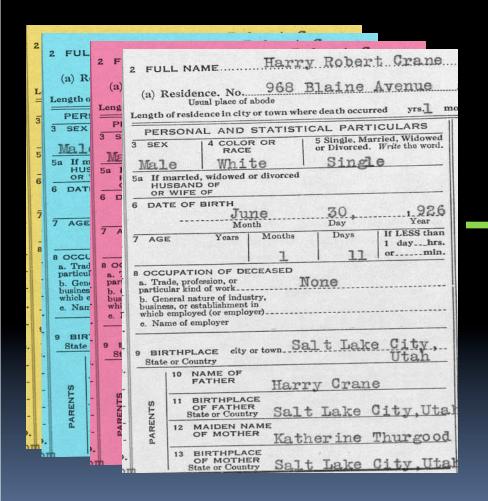
Mother's Maiden: Katherine Thurgood

Bplace of Mother: Salt Lake City, Utah



Searchable Collection

Once a file is indexed/extracted, the information becomes searchable

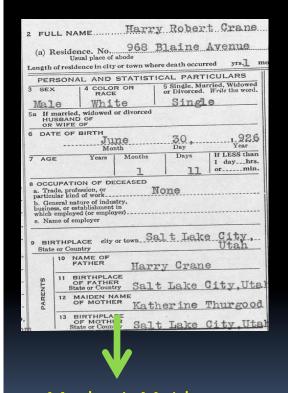






Searching for Ancestors

Patrons can current use <u>www.familysearch.org</u> to search for their ancestors in historical records.



Mother's Maiden: Katherine Thurgood



Search vs. Person-Matching



Katherine Thurgood Utah, Salt Lake County Death Records, 1908–1949	spouse:	Harry Crane	,
Katherine Thurgood	birth:	21 Mar 1912 — Bountiful	,
Utah Marriages, 1887–1966	parents:	Samuel Geo. Thurgood, Mary Holbrook	
	spouse:	Donald Keith Thomas	
	marriage:	27 Nov 1930 — Salt Lake City	
Katherine Thurgood	birth:	Salt Lake City, Utah	,
Utah Deaths and Burials, 1888–1946	spouse:	Harry Crane	
Katherine Thurgood	spouse:	Harry Crane	
utah Death Certificates, 1904-1956			
Katherine R Thurgood	birth:	14 February 1952	
U.S. Social Security Death Index	death:	8 January 2005 — Kern, California	
Katherine Thurgood	birth:	Horsmonden, Kent	
in England and Wales Census, 1891	residence:	England	
Katherine Thurgood	spouse:	Edwarde Howlinge	
England Marriages, 1538–1973	marriage:	01 May 1605 — Hauxton, Cambridge, England	
Katherine M Thorogood	birth:	1885 — Illinois	
United States Census, 1920		, San Bernardino, California	
	spouse:	John H Thorogood	
Kathrine Thurgood	birth:	1912 — Utah	
United States Census, 1920		, Davis, Utah	
	parents:	George Thurgood, Mary Thurgood	

Issues of Straight Search:

A search tries to satisfy the elements of the user's query. It is not trying to find all instances of a particular person. So questions arise

[1] Are these all MY "Katherine Thurgood" or are there multiple people here?

[2] Are there records that are about my "Katherine Thurgood" but this list hasn't provided me?



Defining "Records Match"

"Records Match" is an experimental process whose hypothesis is:

Supposing a person seeks records for an individual X, it <u>should</u> be possible to automatically provide all records that refer to X.





2 FUI	L NAME Harry Robert Crane
	tesidence. No. 968 Blaine Avenue Usual place of abode of residence in city or town where death occurred yrs. 1 mc
PER	SONAL AND STATISTICAL PARTICULARS
3 SEX	. E Single Married, Widowed
Ma.1	e White Single
HU	narried, widowed or divorced SBAND OF WIFE OF
6 DAT	TE OF BIRTH June 30, 1926 Month Day Year
7 AGI	Years Months Days If LESS an 1 day ars.
a. Tra particu b. Ger busine which	UPATION OF DECEASED dde, profession, cr lar kind of work eral nature of industry, ss, or establiahment in employed (or employer) me of employer
9 BIF	THPLACE city or town Salt Icke City, Utah
	10 NAME OF Harr Crane
STN	11 BIRTHPLACE OF FATHER State or Country Salt Lake City, Utal
PARENTS	of MOTHER Katherine Thurgood.
	OF MOTHER Salt Lake City Utal

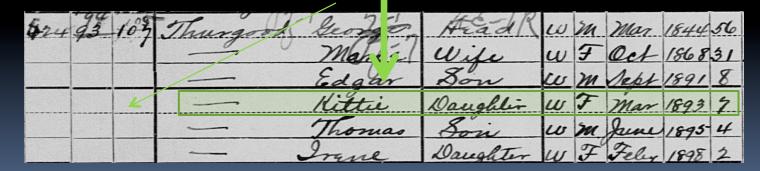
"Katherine Thurgood" of 1926 SLC

Death Record of Child,

IS NOT
Kate Thurgood of 1932 SLC Death
Record of Husband

BUT IT IS Kittie Thurgood of 1900 Census.

2 FL	JLL NAME	Jes	sie	Sout	h Bythev
(a)) Residence. No Usual place		05 (ente	r Street
Length	of residence in ci	ty or town	where	death occ	urr 57 yrs. 4
PE	RSONAL AND	STATIS	STICA	L PAR	TICULARS
3 SE	X 4 COLO		5	Single, M	arried, Widowed Write the word.
Fe		ite		dowe	
OR	married, widowed of SBAND OF T	or divorced	ı		
6 DA	TE OF BIRTH	14	+h	1875	
	Mont		611		19
7 AG		Month	IS	Days	Year If LESS than
	57	4		6	1 day hrs.
a. Tr parti b. Ge busin which	cupation of D rade, profession, or cular kind of wor meral nature of in tess, or establishme in employed (or employer	dustry, int in Reployer) Re	rchs etai lf	1 Gro	
	THPLACE city or Country		Utah		e City
	NAME OF THER		John	Sout	th
PARENTS	OF FAI State or Co		Engl	and	
PAR	12 MAIDEN I	I	Kate	Thu	rgood
	OF MOTHER State or Cou	entry I	Engl	and	





Has "Records Match" Been Done Before?

"Records Matching" appears new, though it has some similarities to a number of efforts around the world:

- [1] Matching patron-submitted ancestries in New Family Search
- [2] Entity disambiguation
- [3] Knowledge Base Population
- [4] Web document clustering
- [5] Cross-document coreference analysis
- [6] Merging of personal ancestral files
- [7] Technologies like Ancestry.com's "Shaky Leaf"

. . .



STRATEGY FOR EVALUATION



Collection Focus: Utah

OVERLAPPING COLLECTIONS

FamilySearch has access to a number of Historical Records Collections from Utah (1850-1956). Overlapping collections is important to creating interesting evaluation results.

COLLECTIONS FOR THIS STUDY

- •Six census collections (1850, 1860, 1870, 1880, 1900, 1920)
- •Utah marriage records
- •Utah death records through 1956
- •Some Utah birth records
- •Indian Affidavits from Utah
- Military records of Utah Veterans



Other "Entity" Evaluations

FAMILY SEARCH WHERE GENERATIONS MEET

There have been a number of evaluations for entity disambiguation/linking which can be useful for comparison:

[1] Web People (Artiles, et al, 2008)

Cluster web pages that are about the same individual even though the names may be the same.

[2] ACE Cross-document Co-ref Task (Przybocky, et al, 2008)

For every individual mentioned in each of a collection of documents, link all of the same individuals across documents.

[3] TAC 2009/2010: Knowledge Base Population Tasks

For some number of seed entities, identify which knowledge base (KB) entry is referred to by the seed, and then discover any new information about that seed which is missing from the KB



Proceed With Seeds

POLICY

Consistent cross-document evaluation is VERY hard for humans. So it is critical to find a set of potential candidate people whose names or variants appear frequently enough to be interesting, but not so frequently that evaluation becomes impossible.

SEEDS

The semi-low-frequency names should be useful for identifying potential variants that may represent the same individual. This will be described in a moment.

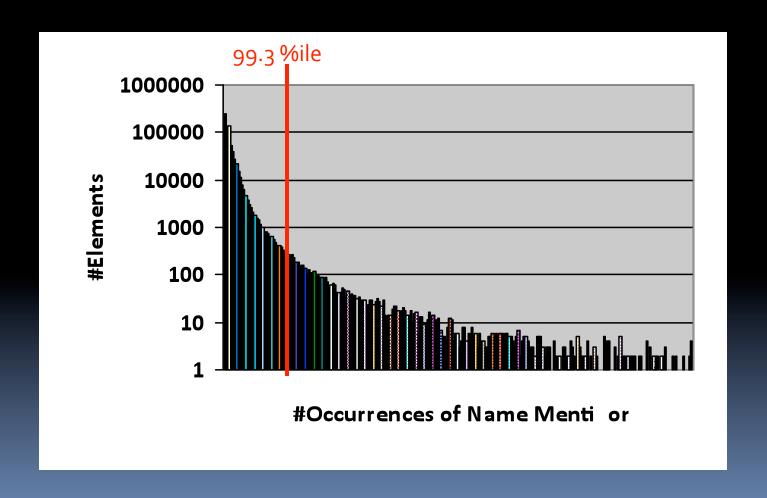
ANALYSIS:

For each exact name string in the Utah collection, count the frequency of the name and use as seeds only names with frequencies of **20** or less.



Proceed with Seeds (2)

If we consider the frequency of any name string in the collection, those name strings that occur with 20 or fewer occurrences represent **99.3%** of all entries.





Proceed with Seeds (3)

Given a particular seed, S, our goal is to find all potential variants for that seed. We did this by:

- [1] Index overlapping n-grams of all the names into a search engine (eg., Apache's SOLR).
- [2] Convert the seed into overlapping n-grams and query the IR engine
- [3] Review, by hand, the top **100** results to identify any variants that look like they could be feasible variants for the seed, S.
- [4] Observe spouse names and, if it looks like S may have undergone a name change (usu. because of marriage or immigration), augment the results by search for each potential name change.
- [5] Add, after the fact, any new names that are proposed by record match engines.



Proceed with Seeds (4)

We select 100 Seeds, generate the possibilities, and evaluated by hand. Approx 2200 mentions, and over 20000 pairs to consider.

APPENDIX A: List of Seed Entities

Seed Identifier	Seed Name Mention
55512093M	Lizzie/Watson
55552047M	Birdie/Price
60729376M	Jennie/Lund
77916025	Robert Cross Osmond
77991813F	Daniel C./Ressler
78001600M	Arminda/Thompkins
78007227F	M. K./Parsons
780373953	Max/Schmidt
796252983	Elvina/Holt
79625579	Nellie Hogenson
796260743	Mary/Siebert
79630447M	Sarah/Haines
79631440	Infant Sharp
1951030413	Miss Alice/Strauss
233756158F	Retter M. Fife
233764135F	Henry Moyle
233794975F	Salud Orozco
233845235	Mabel Ella Lewis Niver
233847218	Ezra Taft Hatch
233854483	
240370277F	Zilpha Wood Urie
	David O Mckay
240420547	Katherine Riley Wilcox
2414061863	Annie Mary/Dunford Munson
2541485953	Lizzie/Bocklund
2877428103	Estella/Ahlstrom
2946674863	Marion Ethel/Johansen
2946678063	Ellen Louise/Miller
2954206363	Mary Ellen/Wardle
295439796	Washington Lemmon
296632298	Uno Peterson
2967015063M	Jean W./Paudie
2967049043F	Henry/Caraex
296778257	Phillip M. Kellogg
2968429493M	Minnie/Donner
296892214F	Bent Hansen
2970439963	Roxey/Nickerson
297102744SM	Elizabeth/Cram
2971223593	Nellie M./Evans
2981026753F	John/Ciroberg
2981031683F	Peter/Larsen Jr
298214322	Chas Vernon Palmer
2985451253M	Mary/Burningham
298715963	James C. Jenson
298861929	Fred Scott
333976982F	Edw. D./Woolley
333981050M	Frances/Vance
333983302F	William G./Crawford
333987745M	Jennie/Campbell
333995294	John Christian Sandberg
333998594	Gottfried Schoene

334054917	Mary Margo Brissell
334063768F	Gus/Kitsopoulos.
3340637815	Blanche/Amold
3340643275	Maggie/Shelledy
3340646858	Chloe Young/Baxter
3340651145	Nicoline/Sorensen
334068334M	Ethel/Adams
334204642	Rose Hannah Lester Lewis
3344725953	Laura/Calegory
3344752185	Albert/Galloway
3344769155	Maude/Potter Meeks
338229823	Matilda Jeffs
351866858	Rufus Call Willey
4384709403	Rula/Broadbent
4384713455	Signora/Powell
464644936	Alace D Wilson
4646819393	Eliza Weston
466467796F	Phillip Paskett
466486142M	Jerusha, Maughan
466576726	Bertel Johnson
466582410	Jacob Dentin
466582452	Ino Kedoman
466614851	Flowers Whorton
487547776	Russell Stevenson
518657862	Miles Skenzich
638862336	Ida Wooley.
652090921	Anna M Lunds.
652102718	Thomas Chipman
652111307	Edwin Hy Hooker
684645939	Ann E Cummings
684670675	W J Wright
848075501	James L Carter
848160043	Willim H Gagon
848257302	Fred Williams Hyke
8490787953	Maren Christina Elton
849089696	Alma W Weed
8494982813	Hellen Preggastis.
849504996	Rose Paoletti
849521052M	Francis C Peacock
8495438793	Blanch H Ahem
849556398 849564522	Susie Mary Schettler
849564522	Alice L Phillips
849594069	Cleo C Beckstead
852027374	Boon Monson
1000153141060F	Hannah C Lawson
1000153141060F	Lemnel T. Steele
10001531496293 1000153203695M	Alice Leigh
1000153203695M	Anne Humble Mary O. Sullivan
1000153217503	
1000408245586	Kathryn Edna Thurgood



Proceed with Seeds (5)

Example: From Seed to Selection Set

Kathryn Edna/Thurgood	295640551-S
Kathryn Edna Thurgood	1000408592286
KATHRYN EDNA THURGOOD	1000408587481-S
KATHRYN EDNA THURGOOD	1000408592284-M
KATHRYN EDNA THURGOOD	1000408592285-M
Kathryn Edna Thurgood	1000408592286
KATHRYN EDNA THURGOOD	1000408592290-M
KATHRYN EDNA THURGOOD	1000408587481-S
Kathryn/Thurgood	77986494-M
Kathryn/Thurgood	455454993-M
Kathryn/Thurgood	455454993-M
Kathryn Thurgood	233750764-M
Kathryn Thurgood	233799133-M
Katheryne Edna/Thurgood	117156205-S
Edna/Thurgood	296654466-S
Edna Thurgood	1000408595047
EDNA THURGOOD	1000408585337-S
Edna Thurgood	848167146
Edna Thurgood	849569781
Edna Thurgood	1000408595047
EDNA THURGOOD	1000408585337-S

Kathrine Thurgood	848166351
Kate/Thurgood	79625714-M
Kate/Thurgood	420048297-M
Kate/Thurgood	420048297-M
Kate Thurgood	233775363-M
Kate Thurgood	351869678-M
Katherine/Thurgood	77985422-M
Katherine/Thurgood	296997578-S
Katherine/Thurgood	453630315-M
Katherine/Thurgood	453630315-M
Katherine Thurgood	233747307-M
Catherine Thurgood	241204791
Kittie Thurgood	466606627
Kathryn Crane	849042896-S
Kathryn Crane	849042897
Kathryn Crane	849042898-M
Kathryn Crane	849042898
Kathryn Crane	849042899-M
Kathryn Inez Crane	77986494
Kathryn Inez Crane	455454993
Kathryn Inez Crane	455454993
Kathryn Inez Crane	233750764
Kathryn Inez Crane	1000408592285
Kathryn Craner	233840170
Kathryn E./Crehan	287378443-S



Annotate Truth Set

Each entry of the expanded table constitutes an instance of a record that contains information. We morph the records data to center around the seed individual & we align the information from each instance in order to vet the results.

Name	ID	Bdate	Bplace	Mdate	Mplace	Ddate	Sname	Fname	Mname	Cname	CBD	СВР	CDD
Kathryn Edna/ Thurgood	295640551- S			22- Jul-14	Salt Lake Co., Utah		Harry Niles/ Crane						
Kathryn Edna Thurgood	1000408592 286	o8 MAR 1893	SALT LAKE CITY,SALT LAKE,UTAH			7- May-81		GEORGE THURGOOD	MARIA STECK				
KATHRYN EDNA THURGOOD	1000408587 481-S			22- Jul-14	Salt Lake City,Salt Lake,Utah		HARRY NILES CRANE						
KATHRYN EDNA THURGOOD	1000408592 284-M	04 APR 1888+/-10					HARRY NILES CRANE			BETTY LOUISE CRANE	4-Apr-20	LAKE,UTAH	_
KATHRYN EDNA THURGOOD	1000408592 285-M	31 OCT 1883+/-10					HARRY NILES CRANE			KATHRYN INEZ CRANE	31-Oct-15	SALT LAKE CITY,SALT LAKE,UTAH	Jan-2
Kathryn Edna Thurgood	1000408592 286	o8 MAR 1893	SALT LAKE CITY,SALT LAKE,UTAH			7- May-81		GEORGE THURGOOD	MARIA STECK				
KATHRYN EDNA THURGOOD	1000408592 290-M	30 JUN 1894+/-10					HARRY NILES CRANE			ROBERT HARRY CRANE	30-Jun-26	SALT LAKE CITY,SALT LAKE,UTAH	Aug-2
KATHRYN EDNA THURGOOD	1000408587 481-S			22- Jul-14	Salt Lake City,Salt Lake,Utah		HARRY NILES CRANE						
Kittie Thurgood	466606627	Mar 1893	Utah					George Thurgood	Marie Thurgood				



Annotate Truth Set (2)

These sets then get broken up into *clusters* based on the dates/places/family relations generated from each line of data. Here, 46 entries (1035 decisions) cluster into 10 GROUPS

SEED: —— Kathryn Edna Thurgood, 1000408592286

Kathryn Edna/Thurgood	295640551-S
Kathryn Edna Thurgood	1000408592286
KATHRYN EDNA THURGOOD	1000408587481-5
KATHRYN EDNA THURGOOD	1000408592284-M
KATHRYN EDNA THURGOOD	1000408592285-M
Kathryn Edna Thurgood	1000408592286
KATHRYN EDNA THURGOOD	1000408592290-M
KATHRYN EDNA THURGOOD	1000408587481-5
Kathryn/Thurgood	77986494-M
Kathryn/Thurgood	455454993-M
Kathryn/Thurgood	455454993-M
Kathryn Thurgood	233750764-M
Kathryn Thurgood	233799133-M
Katheryne Edna/Thurgood	117156205-S
Edna/Thurgood	296654466-S
Edna Thurgood	1000408595047
EDNATHURGOOD	1000408585337-S
Edna Thurgood	848167146
Edna Thurgood	849569781
Edna Thurgood	1000408595047
EDNATHURGOOD	1000408585337-S

Kathrine Thurgood	848166351
Kate/Thurgood	79625714-M
Kate/Thurgood	420048297-M
Kate/Thurgood	420048297-M
Kate Thurgood	233775363-M
Kate Thurgood	351869678-M
Katherine/Thurgood	77985422-M
Katherine/Thurgood	296997578-S
Katherine/Thurgood	453630315-M
Katherine/Thurgood	453630315-M
Katherine Thurgood	233747307-M
Catherine Thurgood	241204791
Kittie Thurgood	466606627
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Kathryn Crane	849042898
Kathryn Crane	849042899-M
Kathryn Inez Crane	77986494
Kathryn Inez Crane	455454993
Kathryn Inez Crane	455454993
Kathryn Inez Crane	233750764
Kathryn Inez Crane	1000408592285
Kathryn Craner	233840170
Kathryn E./Crehan	287378443-S
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SCORING & RESULTS



Scoring

PRECISION:

If the system reports S items and R of them are correct,

Precision=R/S

RECALL:

If the system reports R correct items, but it should have found F of them,

Recall=R/F



Scoring (2)

We evaluate using B-Cubed Method

Ta is the truth set for element a, that Ha is the hypothesis for element a

 $P = |Ta \cap Ha|/|Ha|$

 $R = |Ta \cap Ha|/|Ta|$

T: {A1,A2,A3,A4}, {B1,B2,B3,B4}, {C1,C2,C3} H: {A1,A2,B1}, {A3,C1,C2}, {A4}, {B2,B3,B4}, {C3,UV1,UV2}

Entry	Prec.	Recall	Entry	Prec.	Recall	
A1	2/3	2/4	B3	3/3	3/4	
A2	2/3	2/4	B4	3/3	3/4	
A3	1/3	1/4	C1	2/3	2/3	
A4	1/1	1/4	C2	2/3	2/3	
B1	1/3	1/4	C3	1/1	1/3	
B2	3/3	3/4	(Unvetted/UV: deleted)			

25/33 and the average recall would have been 17/33



New Tools & Need For Evaluations

GenMergeDB is a product of Pleiades
Software Development,
Inc. which suggests that is can be applied to Record Match.

Question: Can we create an evaluation and see how well this, and other technologies, work on Records Matching?



Pleiades Software Development

Creator of GENMERGE

Main

Contact Us

GENMERGE

The Genealogy Merge Utility, GENMERGE, solves one of the most difficult data management problems a genealogist has:

How to find and merge duplicates in genealogy information.

GENMERGE uses statistical record linking techniques to identify potential duplicates within one family database or to combine multiple family databases. GENMERGE currently merges information in GEDCOM files.

Get more information about GENMERGE and your demonstration copy at our website, www.GenMerge.com.

Pleiades Software Development, Inc.

1363 S 1300 E / Salt Lake City, UT 84105 /



On Scoring GenMergeDB

GenMergeDB attempts to link together any reasonable entries from within the whole collection – for the purpose of family reconstitution.

For this eval, we only consider those names that they propose that intersect with the evaluation collection (though we add to the eval any names that they propose to be associated with the seed individual).



Comparison Scores

* We need to compare to a baseline. How well does GenMerge work versus doing NOTHING.... No Merging.

We call this the SHATTER ALL BASELINE.

* We also need to include in the scoring process a comparison as to whether we evaluate SEED entities only, or all SEED-Derived entities.

GenMerge: Seed Clusters Only

	(-	EN MERGE		SHATTER-ALL			
Ave P	Ave R	#Clusters	#Mentions	Ave P	Ave R	#Clusters	#Mentions
0.989	0.690	201	712	1.000	0.143	712	712

If we only look at performance of seed-related clusters, we see that GenMerge has very high precision and reasonable recall (which is about five times better than Shatter-All).



GenMerge: All Clusters

		GEN MERC	E	SHATTER-ALL				
Arro D	Avo D	#Clustons	#N Jantians	Arro D	Arra D	#Clustons	#Montions	
		#Clusters 1049	#Mentions 2197			#Clusters 2197	#Mentions 2197	
				1000	3 .2 3 _			

If we only look at performance of all clusters, we see that GenMerge still has very high precision and great recall.

*The fact that Shatter All has better recall here than with Seed-only clusters suggests that there are associates of non-seed entries which we have not included in scoring but are probably present in the data.



POTENTIAL FOLLOW-ON & CONCLUSIONS



Conclusions

- * Clear that GenMerge software is doing well. The LDS Church's FHD/Family Reconstitution team has taken these results and disseminated GenMergeDB's entire Utah output.
- * There are still records that could be automatically found, so that will require some additional study
- * Right now, testing FamilySearch's Common Pedigree.
- * The study was specific to Utah because of strong overlapping collections. It would be beneficial to revisit this task and look at all US records or all records.
- * We are undertaking an extensive evaluation that might help with this task. Evaluation may also extend the number of results available for this Utah collection.