

## DATA DRIVEN COLLABORATION: A SOCIAL CONSTRUCT FOR MULTIDISCIPLINARY SCIENTIFIC DISCOVERY

Carl Kesselman carl@isi.edu Dean's Professor, Industrial and Systems Engineering Director: Informatics Systems Research Division, Information Sciences Institute University of Southern California



### Acknowledgments



- Many, many conversations with John Seely Brown (jsb)
  - See: <u>Design Unbound</u>: <u>Designing for Emergence in a White Water World</u>, Brown and Pendleton-Jullian, MIT Press
- Rob Schuler
- Karl Czajkowski
- Hongsuda Tangmunarunkit



What does it mean to have a scientific result

- Others have to "know" about it
  - What is the scope and scale of "knowing"
- Others have to be able to validate it
  - Reproduce the method and achieve the same result
  - Achieve the same result via a different method
  - Reuse the result in a new method

"Non-reproducible single occurrences are of no significance to science."

Karl Popper, 1959. The logic of scientific discovery. Hutchinson, London, United Kingdom.



### How do we create a scientific result



Any time scientists disagree, it's because we have insufficient data. Then we can agree on what kind of data to get; we get the data; and the data solves the problem. Either I'm right, or you're right, or we're both wrong. And we move on. That kind of conflict resolution does not exist in politics or religion.

Neil deGrasse Tyson

- Science is about <u>communities</u> arguing over <u>data</u>
  - How do those communities form
  - How do communities argue: knowledge capture and communication



# Data driven multidisciplinary collaboration is a adaptive socio-technical eco-system



- How do manage social and technical subsystems
- How do we optimize across the ecosystem across time and space

#### Social Subsystem

Concerned with the attributes of people (e.g. skills, attitudes, values), the relationships among people, reward systems, and authority structures

Joint Optimization <u>Technical Subsystem</u> Concerned with the processes, tasks, and technology needed to transform inputs to outputs

Man-computer symbiosis ... aims are 1) to let computers facilitate formulative thinking ...., and 2) to enable men and computers to cooperate in making decisions and controlling complex situations without inflexible dependence on predetermined programs.

Militello, e. al.. (2013). Sources of variation in primary care clinical workflow: Implications for the design of cognitive support. Health informatics journal.

Licklider, 1960

#### USC Viterbi School of Engineering

## Top down or bottom Up: The TIM<sup>n</sup> perspective



- Tribes
- Institutions
- Markets
- Networks

Ronfeldt, David, Tribes, Institutions, Markets, Networks: A Framework About Societal Evolution. Santa Monica, CA: RAND Corporation, 1996.

# Traditional eScience projects look like markets built around episodic exchange of papers/data (publication)

Transformational science requires networks.



## Community of practice



A group of people....

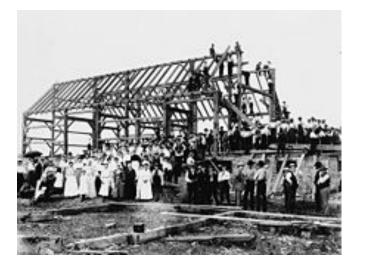
- With diverse viewpoints, role, etc.
- Engaged in joint work
- Over a significant period of time,
- In which they build things, solve problems, learn , invent, and negotiate meaning,
- And evolve a way of talking and reading each other!



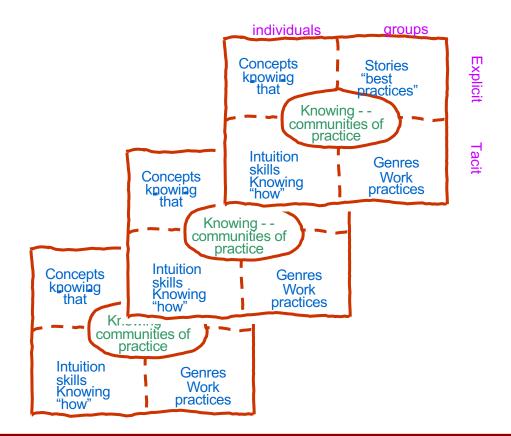


## Networks of practice for transformational science

• Multiple communities working together in integrated, dynamic, adaptive and open collaboration



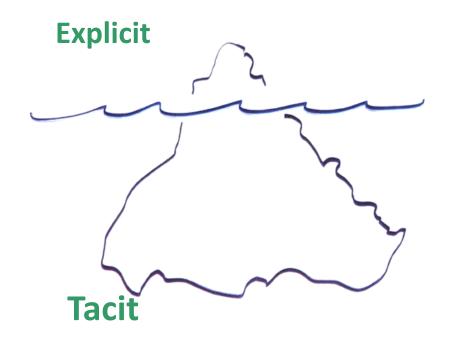






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### Dimensions of knowledge (jsb)

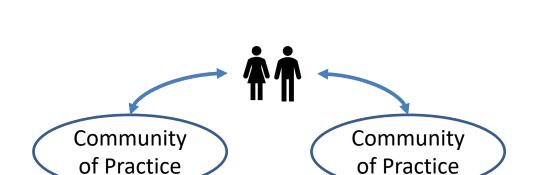


- Learning as enculturation into a practice learning to be.
- the tacit dimension can't be completely converted to explicit
  - but some of it can consider the doing of science.



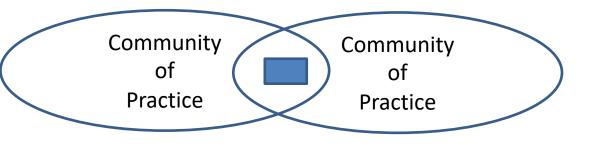
## Boundary objects and knowledge brokers

Knowledge flow across communities of practice



**Translator/Knowledge Broker** 

### **Boundary object**



Information used in different ways by different communities. Boundary objects are plastic, interpreted differently across communities but with enough immutable content to maintain integrity.

> Star, Susan Leigh, and James R. Griesemer. "Institutional Ecology, `Translations' and Boundary Objects: Amateurs and Professionals in Berkeley's Museum of Vertebrate Zoology, 1907-39." *Social Studies of Science* 19, no. 3



### Data as a boundary object



- Must be findable by network of practice,
- Must be accessible across the network while following norms of the community
- Must be interpretable by other community (interoperable)
  - The bits
  - The terms we use to describe
  - The relationships between elements

Where have we seen these requirements before.....



## FAIR data...



### • Findable

- identified by a unique identifier, characterized by rich metadata

- Accessible
  - standard protocol with access control, metadata accessible even when the data is not,
- Interoperable
  - by standardized terms to describe it
- Reusable
  - Accurate and relevant attributes.



## FAIR collaboration



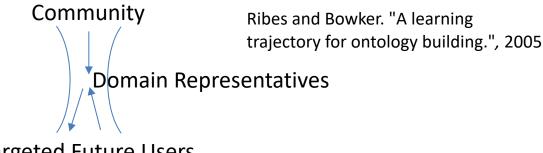
- Data as boundary object → Create FAIR data at every part of a scientific investigation
  - Enable "long tail" science organized around data
- Requires accurate descriptions of data
  - Characteristics of data element
  - Relationships between data elements
- Question: How do we create and maintain these metadata and relationships in a collaborative environment?



## Collaboration is an evolutionary process



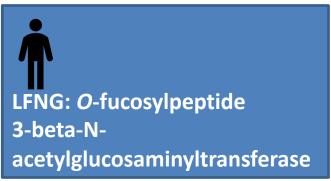
• Data interoperability, e.g. structure and meaning is time-dependent



Targeted Future Users

 Any evaluation of FAIRness is ill-posed unless we specify <u>community</u> and point in <u>time</u>!







## Tacit Knowledge in data driven collaboration



- Data captures core knowledge of community/network of practice
  - Explicit knowlege
- Tacit knowledge required as well
  - Workflow systems
  - "Web" and interaction analytics

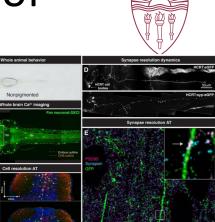


# Difficulty of managing large, complex collections of data throughout research activities

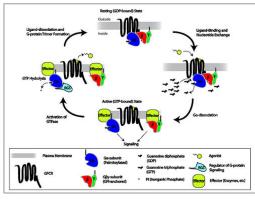
"When the Sloan Digital Sky Survey started work in 2000, its telescope in New Mexico collected more data in its first few weeks than had been amassed in the entire history of astronomy." (Economist 2010)

"Large amounts of data are generated using a variety of innovative technologies and the limiting step is accessing, searching and integrating this data." (Claus, Underwood, 2002)

- 50% or more time spent on data wrangling; (Kandel et al 2011)
- threaten validity of results and (10%) reproducibility; (Begley, Ellis 2012)
- and sparsity of sharing; (Borgman 2011)



**Synaptome**: complex, in-vivo, longitudinal experiment

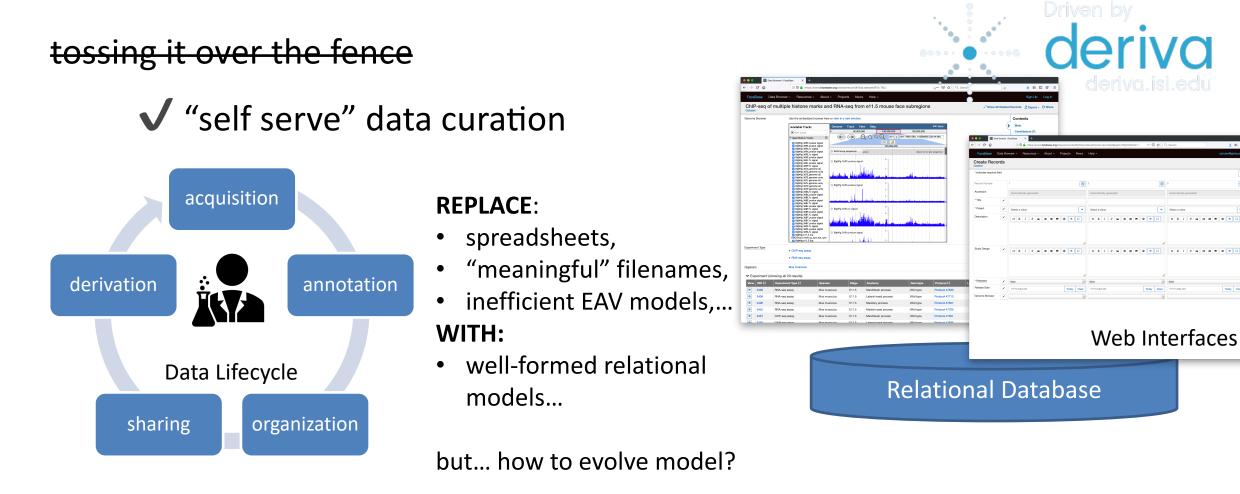


**GPCR**: pharma drug discovery



# Turn scientists into active participants throughout the data lifecycle





(Schuler, Czajkowski, Kesselman 2014; Schuler, Czajkowski, Kesselman 2016; Bugacov et al 2017)





## Scientific asset management system

Discovery Environment for Relational Information and Versioned Assets (DERIVA)

- Data Driven Collaboration
  - Think of it as a "photo manager" for scientific data
  - Maintain FAIR data from creation through publication
- Captures data and relationships between data
  - Catalog to capture relationships between data
  - Object store to hold data
- Can rapidly change to follow changes in scientific knowledge



## DERIVA promotes FAIR data production



- F: providing rich metadata using an Entity-Relationship model to express relationships between diverse data elements;
- A: offering rich access control and access to metadata via standard HTTP web service interfaces;
- I: integrating with standardized terms defined by collaborators, consortium or communities; and
- R: supporting dynamic model evolution so that the data presented accurately represents the current structure and state of knowledge within an investigation.

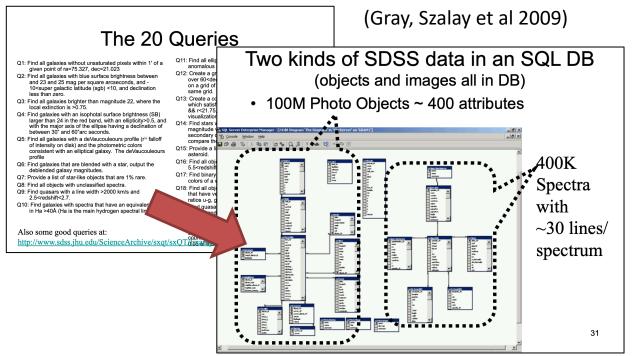


# The "20 questions" approach, gets it started, but we need more agile methods throughout formative

phases



### Drive database and system design by ~20 key queries



### However...

"Database technology has had limited uptake [in science and data science], in part due to the overhead in designing a schema... Changing data and changing requirements make it difficult to

amortize these upfront costs..."

(Jain et al 2016)

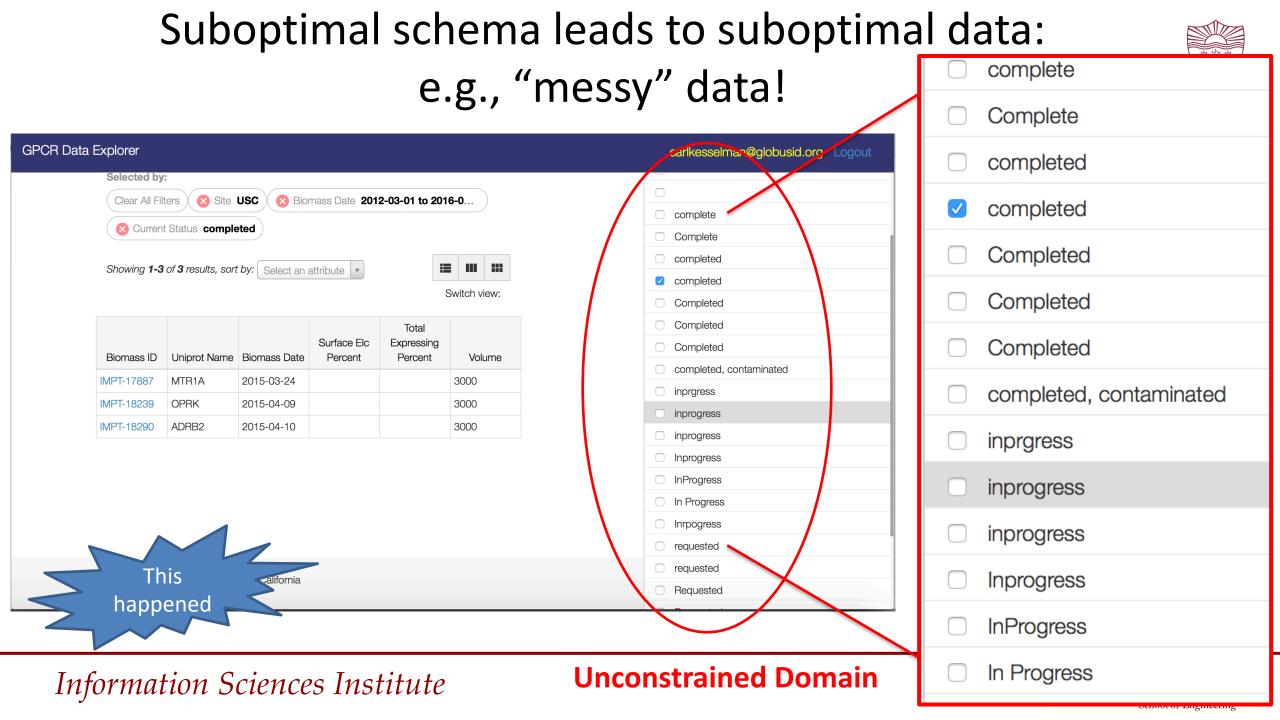


http://jimgray.azurewebsites.net/talks/SciData.ppt



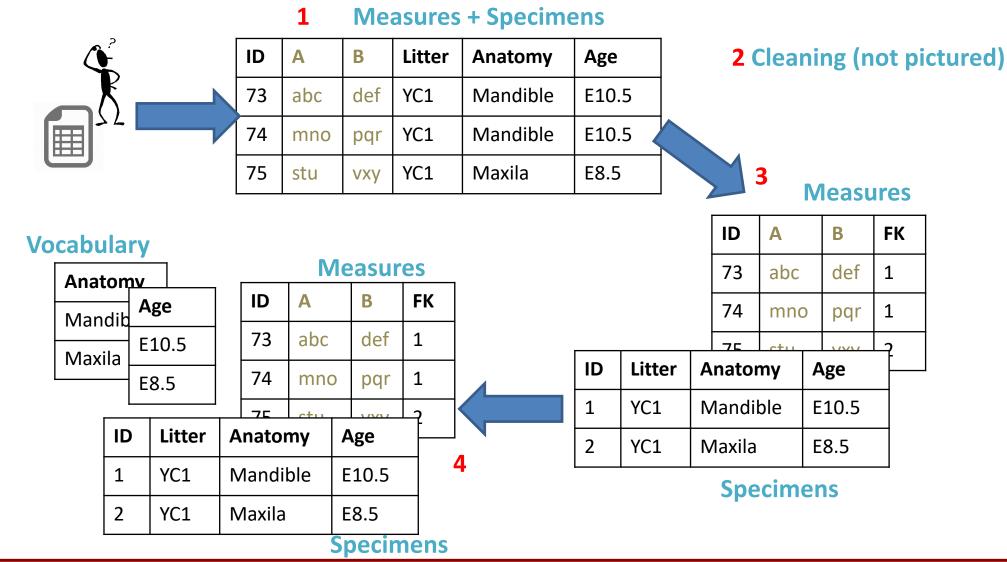
- "Everyone starts with the same schema: <stuff/>. Then they refine it."
  - J. Widom





### Numerous steps to evolve even "simple" database







## Open challenges for schema evolution remain...



### **Current situation:**

- Coordination of numerous SQL operations
- 2. Data migration, decoupled
- 3. Operations outside scope of SQL

(non-trivial manual effort, human error)

### What scientists need are:

- 1. Operations closer to the scientific domain (fewer and less complex)
- 2. Streamlined operations (for transforming data and schema)
- 3. Seamless use of general-purpose languages for specialized transforms
- 4. Efficient expression evaluation

Schema evolution is ... Transformation of a database schema that preserves instance data



# Requirements distilled from reported and observed uses of databases in science



- 1. Define and alter tables of domain concepts
- 2. Create or change relationships between domain concepts
- 3. Capture categories of domain concepts (combine or separate sets)
- 4. Partition or merge tables of domain concepts (normalize/denormalize)
- 5. Express new concepts that were embedded in others (reify concepts)
- 6. Integrate data from external sources (external DBs, spreadsheets,...)
- 7. Increase the semantic coherence of data (align values, new domains,...)





Emerging "Database Evolution Languages" help, but the level of abstraction is still close to SQL



- Database Evolution Language (DEL)
  - Schema Modification Operators
     (SMOs) the operations of the DEL
  - Recent Examples: PRISM, BIDEL
- Primary contribution
  - schema versioning (backward compatibility) for enterprise and web information systems
  - Do not provide significantly higher level of abstraction to users

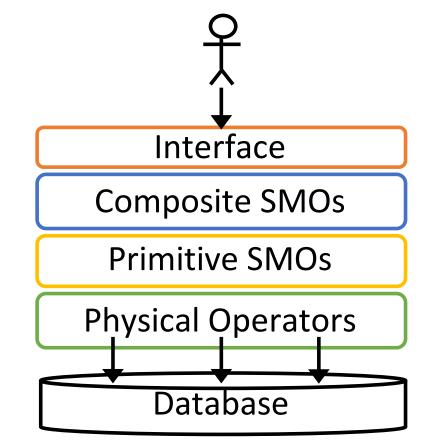
```
Schema Modification Operators (SMO) Syntax
CREATE TABLE R(a,b,c)
DROP TABLE R
RENAME TABLE R INTO T
COPY TABLE R INTO
MERGE TABLE R, S INTO T
PARTITION TABLE R INTO S WITH cond, T
DECOMPOSE TABLE R INTO S(a,b), T(a,c)
JOIN TABLE R, S INTO T WHERE cond
ADD COLUMN d [AS const|func(a, b, c)]
                                  INTO R
DROP
     COLUMN C FROM R
RENAME COLUMN b IN R TO d
```

PRISM++ (Curino, Moon, Zaniolo, Deutsch 2013)



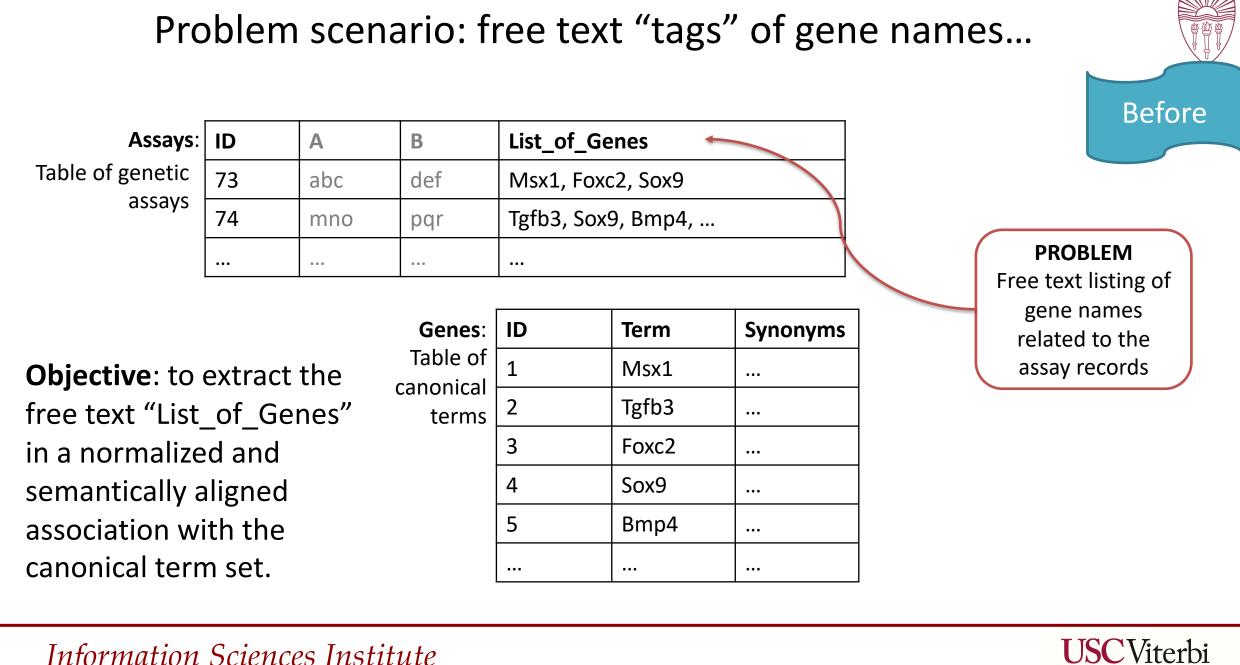
Our approach: An open, extensible DEL based on an algebra of primitive and composite SMOs

- Primitive SMO: indivisible operators, extended definitions of more common relational operators
- Composite SMO: defined as a functional composition over other (primitive or composite) SMOs
- Algebraic expressions can be decomposed and rewritten into semantically equivalent, more efficient expressions.
- Embed in general-purpose language with user programs *translated into the algebra*.

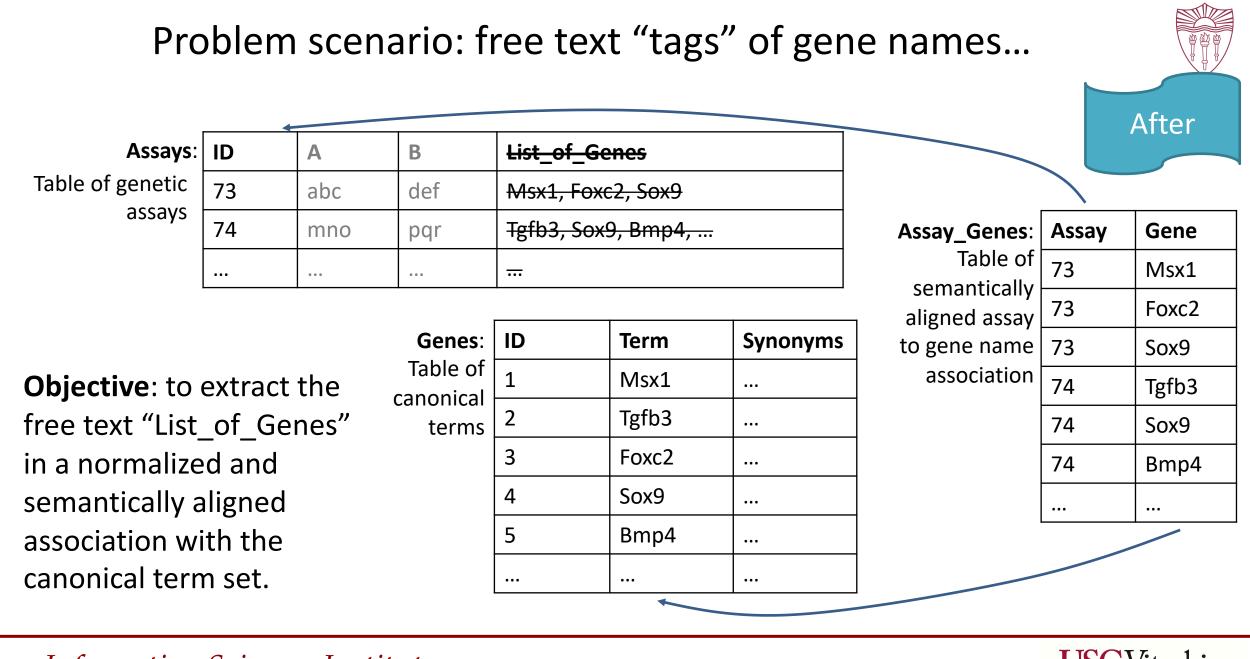


Conceptual overview of the approach





School of Engineering







d Tagify<sub>a</sub> r

Iteratively apply composite SMO definitions until we have an expression of only primitive SMOs

Input: d: Genes

*r*:Assays

Parameters:
a:List\_of\_Genes
(others omitted for brevity)

Result: Computes association table





### d Tagify<sub>a</sub> $r \mapsto d$ Align<sub>a</sub> (Atomize<sub>a</sub> r)

(Tagify definition)

Input:	
--------	--

**d**: Genes

*r*: Assays

Parameters:
a: List\_of\_Genes
(others omitted for brevity)

Result: Computes association table





### $d \operatorname{Tagify}_{a} r \mapsto d \operatorname{Align}_{a} (\operatorname{Atomize}_{a} r)$ $\mapsto d \operatorname{Align}_{a} (\mu (\operatorname{Reify}^{\operatorname{Sub}}_{a} r))$

(Tagify definition)

(Atomize definition)

Input: d: Genes

*r*: Assays

Parameters:
a: List\_of\_Genes
(others omitted for brevity)

Result: Computes association table





(Tagify definition)(Atomize definition)(ReifySub definition)

Input: d: Genes

*r*:Assays

Parameters:
a: List\_of\_Genes
(others omitted for brevity)

Result: Computes association table  $d \operatorname{Tagify}_{a} r \mapsto d \operatorname{Align}_{a} (\operatorname{Atomize}_{a} r)$  $\mapsto d \operatorname{Align}_{a} (\mu (\operatorname{Reify}^{\operatorname{Sub}}_{a} r))$  $\mapsto d \operatorname{Align}_{a} (\mu (\pi_{\operatorname{kev}(r), a} r))$ 





Input: d: Genes

*r*: Assays

Parameters:
a: List\_of\_Genes
(others omitted for brevity)

Result: Computes association table  $d \operatorname{Tagify}_{a} r \mapsto d \operatorname{Align}_{a} (\operatorname{Atomize}_{a} r)$   $\mapsto d \operatorname{Align}_{a} (\mu (\operatorname{Reify}^{\operatorname{Sub}}_{a} r))$   $\mapsto d \operatorname{Align}_{a} (\mu (\pi_{\operatorname{key}(r),a} r))$  $\mapsto \varrho_{t/a} (\pi_{-a,-s} (\mu (\pi_{\operatorname{key}(r),a} r)) \bowtie_{\Xi} d)$ 

(Tagify definition) (Atomize definition) (ReifySub definition)

(Align definition)





- ERMRest: A web service for managing metadata and relationships between data assets
  - Everything is a resource with a URI and interface
- Entity/Relationship modeling



## Data API



- All operations mapped into URL: ermrest/catalog/1@Y-1Z4B/entity/foo/bar/x::gt::7
  - -Queries can be viewed as naming data
  - Tables exchanges as CSV or JSON
- Operate on whole or partial entity, projections, aggregates
- Joins, filter-based row selection, column projection, configurable sort order, and pagination.
- Insertion, update, or deletion of data in one table at a time.



# Fine grain access control

- ACL = (resource, permission, roles)
  - -schema, table, column, or reference
  - access permission (e.g., insert, update, etc.)
  - -a set of user or group identity
- ACL is associated with a resource in the hierarchy:
  - -catalog, schema, table, column, and constraint
- ACLs are inherited simplifying management
- Static and dynamic policy specifications



# Snapshots and history



- Logical snapshots at every catalog mutation
  - Prior values are stored in the catalog
  - Snapshot ID created for every snapshot
- Catalog URI can include snapshot ID

-ermrest/catalog/1@Y-1Z4B/entity/foo/bar/x

- History Management
  - Range Discovery, Truncation, Policy Amendment, Data Redaction



# Persistent identifiers



- Every entity ERMRest has unique ID (RID)
  - Assigned by catalog, can be used as foreign-key
- Every version of entire catalog has a unique ID.
- Query with snapshot ID uniquely names a entity set
   ERMRest URI with snapshot ID
- RID and Snapshot ID uniquely name an specific version of entity
- Support for identifiers from community controlled vocabulary
  - E.g. Uberon, Schema.org, RRIDs



## Evolving applications with schema

- Hard problem in general
  - In practice, schema are broken to accommodate applications.
- Pragmatic solutions:
  - Loose coupling around interchange format
  - Model introspection and dynamic interfaces

## Big data bags

- A packaging format for encapsulating
  - Payload: arbitrary content
  - Tags: metadata describing the payload
  - Checksums: supports verification of content

```
Bio_data_bag/
|-- data
| \-- genomic
| \-- 2a673.fastq
| \-- 2a673.fastq
| -- manifest-md5.txt
| afbfa23123bfa data/genomic/2a673.fasta
| -- bagit.txt
Contact-Name: John Smith
```



Chard, Kyle, et al. "I'll take that to go: Big data bags and minimal identifiers for exchange of large, complex datasets." 2016 IEEE International Conference on Big Data (Big Data). IEEE, 2016



# Making Bags big



- Manifest lists all content and checksums
- Available content contained in "data" directory
- Content may be "missing"
  - Missing content must be listed in "fetch.txt"
  - Fetch entries list local name in data directory, and URL of where to fetch data
- Have created tool for creating, validating and materializing bags



# Open Knowledge Foundation Table Schema

Rich metadata for Bags

```
"name": "Method",
"schema": {
 "fields": [
     "name": "id",
     "title": "A globally unique ID",
     "type": "string",
     "constraints": { "required": true, "unique": true}
 "missingValues": [""], "primaryKey": "id"
```



```
"@context": {
   "@vocab": "http://purl.org/dc/terms/",
   "dcmi":
"http://purl.org/dc/dcmitype/Dataset"
 λ
 "@id": "../../data/numbers.csv",
 "@type": "dcmi:Dataset",
 "title": "CSV files of beverage
consumption",
"description": "A CSV file listing the number
of cups consumed per person."
```



# Chaise – An adaptive model-driven Web user interface

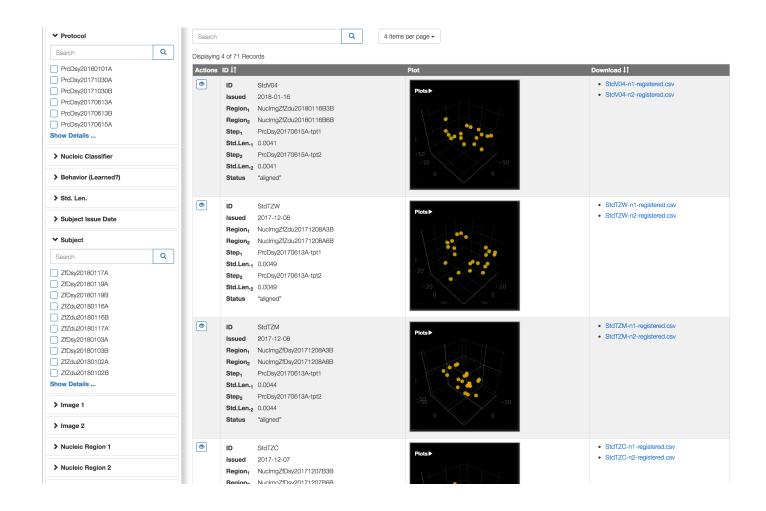


- How little can we assume?
  - discovery, analysis, visualization, editing, sharing and collaboration over tabular data (ERMRest).
- Makes almost no assumptions about data model
  - Introspect the data model from <u>ERMrest</u>.
  - Use heuristics, for instance, how to flatten a hierarchical structure into a simplified presentation for searching and viewing.
  - Schema annotations are used to modify or override its rendering heuristics, for instance, to hide a column of a table or to use a specific display name.
  - Apply user preferences to override, for instance, to present a nested table of data in a transposed layout.



## Management of all scientific assets





#### USC Viterbi School of Engineering

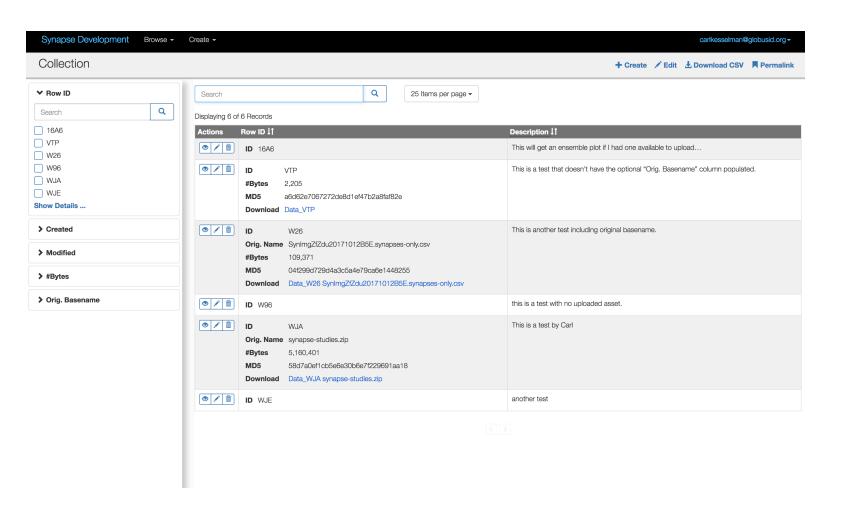
## Dashboards to track progress



' Fish	Bearc	sh	Q 20 Items per page	•			
om:	Displavi	ing 20 of 24 Records					
		ns Classifier ↓↑	Modified ↓↑	Fish ↓†	Regions 11	In Progress 11	Segmented 11
:		William Dempsey	2018-02-05 16:47:34	85	261	5/2614S1N	173 173N
5		Serina Applebaum	2018-02-02 16:09:19	30	65	2/652S	63 63S
		Kaori Watanabe	2018-01-08 17:57:51	19	46	1/461S	40 40S
Regions			2018-02-02 16:24:06	76	232	0/232	39 35S 4N
In Progress		Phillip Richards	2018-02-02 15:12:20	25	53	2/532S	28 28S
Segmented		Austin Nguyen	2018-02-06 15:36:02	13	28	2/282S	25 25S
		Nicki Karimi-Mostowfi	2018-02-06 16:48:42	11	24	1/241S	23 23S
		Yasmin Davis	2018-01-08 17:43:14	9	25	0/25	20 16S 4N
		Emily Yang	2018-02-06 14:38:22	10	20	0/20	18 18S
		William Liu	2018-02-02 16:26:31	5	12	0/12	12 12S
		Weiguang Weng	2018-01-08 16:34:12	4	10	1/101S	8 8S
		Emma Factor	2018-01-08 16:34:12	3	6	0/6	5 5S
		Helen Jin	2018-02-06 15:21:53	2	6	1/61S	4 4S
		Matt Jones	2017-10-26 19:44:11	3	8	0/8	4 4S
		Lilit Oganessian	2018-02-05 12:01:23	2	4	0/4	2.28
		Zhuowei Du	2017-10-02 18:05:25	4	8	2/82N	2 2N
		Benjamin Shapero	2018-01-08 17:52:38	5	9	1/91S	1 1S
		Porshad Elie	2018-01-08 17:18:41	1	2	0/2	1 1S
		Donald Arnold	2017-10-02 18:05:25	2	2	0/2	0
	•	Karl Czajkowski	2017-12-14 13:22:35	1	1	0/1	0



## Dynamic data collections with global IDs





## Model driven data entry...



Synapse Dev	/elopment Browse - Create - carlkes	selman@globusid.org -
Create Beha * indicates required fie		Submit Da
		+
Record Number	1	
Behavior	Automatically generated	
* Subject	Select a value	~
Experimentalist	Select a value	~
Room Date	Date YYYY-MM-DD	
	Time HH:MM:SS	AM
Image Date	Now Clear	
indgo Dato	Date         YYYY-MM-DD           Time         HH:MM:SS	AM
	Now Clear	
FScope	Select a value	~
Image Step	Select a value	•
Std. Len.		
Volume		
Trial Counts		
Notes		



## With controlled vocabulary.



	Search	n	Q 25 Items per page •	
nber		ng 15 of 15 Records		
	Select	Dummy-123	Term If Dummy-123	
	C	FScope-1	Fish Scope 1 in	
	C	FScope-2	Fish Scope 2 in	
list	C	TEMP_2017-06- 22_FScope1	has boops 2 in background level light was adjusted for "3 level" illumination (background level, level when CS is on, level when US is on); probably will need to be adjusted again	
	C	20170125_FScope1	FScope1 was re-initialized after the camera failed in January; restarted as of 2017-01-25	
	6	Temp_FScope1_newCaddy	This is the first attempt at finding parameters for FScope1 with an imaging caddy. Note that the new (and hopefully final) version of the caddy is coming soon and will differ from this one somewhat, which is why I say Temp	
	C	Temp_FScope2_newCaddy	This is the first attempt at finding parameters for FScope2 with an imaging caddy. Note that the new (and hopefully final) version of the caddy is coming soon and will differ from this one somewhat, which is why I say Temp	
	C	2016-06-22_FScope2	Second adjustment of background level light for "3 level" illumination (background level, level when CS is on, level when US is on)	
	C	20170125_FScope1_2x	Like 20170125_FScope1 but without the normal binning, so video is 2x2 as many pixels	
	C	20170315_FScope2	FScope2 lost its original camera and computer in January; the heating laser also turned out to be unreliable at maintaining a consistent power level throughout the training rounds so it needed to be replaced; the computer, camera, and laser were replaced; Took until March for the FScope to be operational again	
	C	2017-06-28_3Lvl_FScope2	Yet another adjustment of background level light to get "3 level" illumination for better contrast (background level, level when CS is on, level when US is on)	
	C	2017-06-28_3Lvl_FScope1	Adjustment of background level light to get "3 level" illumination (background level, level when CS is on, level when US is on)	
	C	20160116_Fscope1	Early iteration of FScope1 collecting 800x600 movies with wide framing.	
	C	20161122_FScope2	Early iteration of FScope2 with small 284x228 movies and tighter framing.	
	C	20170620_FScope2	FScope2 was operating with a low level of background NIR light; Now, we have increased the background level at rest ("Dark" periods) from -25 intensity units to -100	



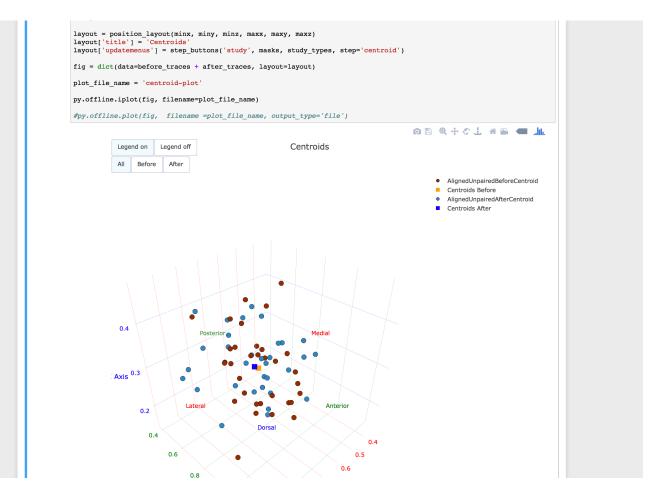


	VEBLOTER JJ BLUATEB						
In [14]:	sp.get_studies()						
	'AlignP2': {'x': 79, 'y': 904, 'z': 59},						
	'Aligned': True,						
	'Alignment': <synspy.analyze.pair.imagegrossalignment 0x811a07550="" at="">,</synspy.analyze.pair.imagegrossalignment>						
	'AlignmentPts': {},						
	'BeforeImageID': 'ImgZfDsy20160909A3',						
	'BeforeURL': '/hatrac/Zf/ZfDsy20160909A/SynStd6473-s1-registered.csv:3D7ACQZ2FZIZMRC3KCTLK3PWEU',						
	'Learner': False,						
	'Paired': False,						
	'Protocol': 'PrcDsy20160101A',						
	'Provenence': {'CatlogVersion': '2P9-5Z0X-E12P',						
	'GITHash': 'c877aa13709b12d701ae2afe95faeaf4944c81f3'},						
	'Region1': 'SynImgZfDsy20160909A3C',						
	'Region2': 'SynImgZfDsy20160909A6B',						
	'Study': 'SynStd6473',						
	'StudyAlignmentPts': x y z						
	0 -6.393723e-09 8.331937e-08 -3.033229e-08						
	1 1.554701e+00 1.438417e+00 -4.437405e-08						
	2 -4.365282e-09 1.000000e+00 -4.630136e-08,						
	'Subject': 'ZfDsy20160909A',						
	'Type': 'nonlearner'},						

Web services interface can be used to pull data directly from catalog. Notice that all data assests are versioned (BeforeURL), and that we have the exact snapshot version of the data catalog and code, allowing us to perform RDA compliant persistent search.

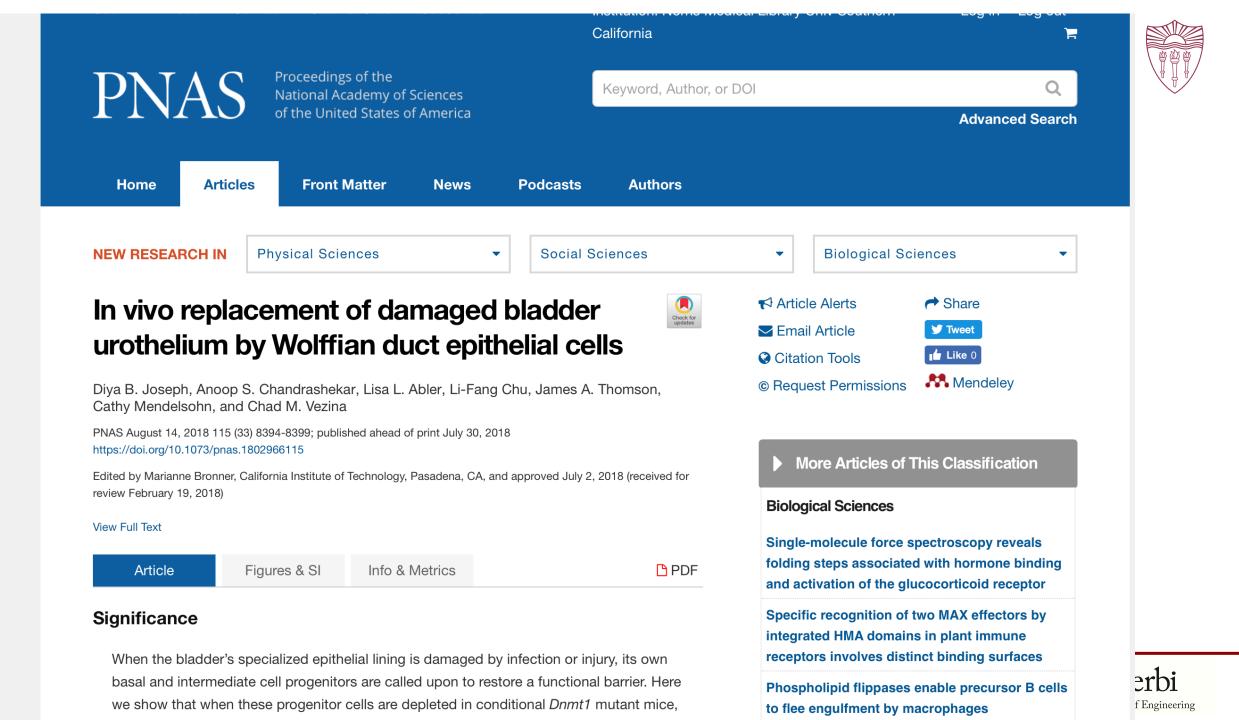






Interaction with the notebook allows us to plot data. Plots can be placed into catalog as an asset that is part of the study.







#### Methods

#### Data Dissemination.

To increase rigor, reproducibility, and transparency, raw image files and other data generated as part of this study were deposited into the GUDMAP consortium database and are fully accessible at: https://doi.org/10.25548/W-QXXC (**25**).

#### Conditional Dnmt1 Mutants.

Mice were housed as previously described (26). All procedures performed on mice were approved by the University of Wisconsin–Madison Animal Care and Use Committee and were carried out in accordance with the Guide for the Care and Use of Laboratory Animals. *Shh*<sup>cre</sup> alleles (B6.Cg*Shh*<sup>tm1(EGFP/cre)Cjt/J</sup>) (11) were used to conditionally inactivate *Dnmt1* using *Dnmt1flox* alleles (B6.129S4-*Dnmt1*<sup>tm2Jae/Mmucd</sup>) in *Shh* lineage cells marked





### In vivo replacement of damaged bladder urothelium by Wolffian duct epithelial cells COLLECTION

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RID	W-QXXC					Contents
Title	In vivo replac	cement of damage	ed bladder urothelium by W	/olffia	n duct epithelial cells	n duct epithelial cells Main
Description	Figures and c Joseph et al.	•	e PNAS 2018 paper titled "	In viv	o replacement of damaged bladder urothelium by Wolffian duct epithelial cells" by	vo replacement of damaged bladder urothelium by Wolffian duct epithelial cells" by <b>He Slide (</b>
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	1C	W-QY66	W-QY6T, W-QY86			
	1D	W-QY8Y	W-QY9A, W-QYA6			
	1E	W-QYB6	W-QYBP, W-QZ6T			
	1F	W-QYC2	W-QYCE, W-QYCT			
	1G	W-QYDP	W-QYDY, W-QYEA			
	1H	W-QYEP	W-QYF2, W-QYFE			
	11	W-QYGP	W-QYH2, W-QYHE			
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In vivo replacement of damaged bladder urothelium by Wolffian duct epithelial cells COLLECTION

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۲	W-R01Y		Urogenital sinus from Control embryo (Shhcre/+; Dnmt1flox/+) (1 of 3)	Mus musculus	urogenital sinus	18.5 embryonic days	Male	20160826ShhcreDnmtiLOFME18.5U	↔
۲	W-R02A		Urogenital sinus from Control embryo (Shhcre/+; Dnmt1flox/+) (2 of 3)	Mus musculus	urogenital sinus	18.5 embryonic days	Male	20160826ShhcreDnmtiLOFME18.5U	
	W-R02P		Urogenital sinus from Control embryo (Shhcre/+; Dnmt1flox/+) (3 of 3)	Mus musculus	urogenital sinus	18.5 embryonic days	Male	20160826ShhcreDnmtiLOFME18.5U	
۲	W-R02Y		Urogenital sinus from Conditional Dnmt1 embryo (Shhcre/+; Dnmt1flox/flox) (1 of 3)	Mus musculus	urogenital sinus	18.5 embryonic days	Male	20160826ShhcreDnmtiLOFME18.5U	
۲	W-R036		Urogenital sinus from Conditional Dnmt1 embryo (Shhcre/+; Dnmt1flox/flox) (2 of 3)	Mus musculus	urogenital sinus	18.5 embryonic	Male	20160826ShhcreDnmtiLOFM	

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### In vivo replacement of damaged bladder urothelium by Wolffian duct epithelial cells

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11       W-QYGP       W-QYH2, W-QYHE         1J       W-QYHT       W-QYJ6, W-QYJJ		1G	W-QYDP	W-QYDY, W-QYEA			
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		bag-info.txt	299 bytes	Plain Text	Today at 12:35 AM
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# Summary



- Think of eScience infrastructure as part of socio-technical system
  - Design for the interface across communities of practice
- Validated this approach with Deriva across many domains and scales
  - Craniofacial dysmorphia, protein structure database, molecular atlas, kidney reconstruction, dynamic synapse mapping, optimization models, pancreatic beta cell modeling, developmental biology, ...
- Other platform approaches possible
  - E.g. L. Trani, M. Atkinson, D. Bailo, R. Paciello, R. Filgueira, Establishing core concepts for information-powered collaborations, FGCS 89 (2018) 421–437.
- For more information: www.derivacloud.org



