# Categorical Informatics At Scale

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Conexus Al

SemWebPro 2020

#### $\Sigma\dashv\Delta\dashv\Pi$

## Outline

#### The

- Who
- What
- When
- Where
- Why
- How

of Conexus and what it means to you, a semantic web user.

#### Conexus Overview & Relevance

- Who: David Spivak (math), myself (cs), Eric Daimler (business), et al.
- What: solving problems in ETL, data integration, IT interoperability, etc. (data)
- How: Kan extensions, limits and co-limits, etc. (functorial data migration)
- Why: because other technologies cannot solve these problems. (fun and profit)
- Where: San Francisco, Boston, Munich (Daniel Filonik) (also friends at NIST/DC).
- When: 2015-2018 Grant funded; 2018-present Seed stage VC funded.
- Relevance to you:
  - Use and/or contribute to the open source CQL project to do semantic web: CQL is a better OWL than OWL.
  - Use the free and/or commercial CQL IDE and/or our team to manipulate data "using real math"
    - Really hard due to non-computability issues often ignored for pragmatic reasons by mathematicians.
  - Sometimes we hire!
  - We collaborate with entrepreneurs, academics, programmers, domains experts, and more.
    - Data wrangling: it's dirty job, but someone's got to do it

### CQL Overview

- Category theory was designed to migrate theorems from one area of mathematics to another, so it is a very natural language with which to describe how to migrate data from one schema to another.
- Community site: <u>http://categoricaldata.net</u>
- Projects:
  - NIST several projects.
  - DARPA BRASS project.
  - Empower Retirement.
  - Stanford Chemistry Department.
  - Uber/Apache Tinkerpop (joint paper: 'algebraic property graphs')



Emp						
ID	mgr	works	first	last		
101	103	q10	Al	Akin		
102	102	×02	Bob	Bo		
103	103	q10	Carl	Cork		

Dept				
ID	sec	name		
q10	101	CS		
×02	102	Math		





Emp						
ID	mgr	works	first	last		
101	103	q10	AI	Akin		
102	102	×02	Bob	Bo		
103	103	q10	Carl	Cork		

	Dept		
ID	sec	name	
q10	101	CS	
×02	102	Math	



Run       New       Open       Save       Deploy       Options       <
Untitled 1.cql × *Employees ×
2
3       4: typeside Ty = literal {       Sort         20       21⊡ schema S = literal : Ty {       > schema S         21⊡ schema S = literal : Ty {       > instance I : S         23       Employee       > equations         24       Department       foreign_keys         26       manager : Employee -> Employee       first(b) = Bob         26       worksIn : Employee -> Department       last(b) = Bo
4E       typeside Ty = literal {         20       schema S = literal : Ty {         21 schema S = literal : Ty {       instance I : S         22 entities       entities         23 Employee       pepartment         24 Department       foreign_keys         26 manager : Employee -> Employee       last(b) = Bo         26 worksIn : Employee -> Department       first(c) = Carl
20         21□ schema S = literal : Ty {         22       entities         23       Employee         24       Department         25       foreign_keys         26       manager : Employee -> Employee         27       worksIn : Employee -> Department
21□ schema S = literal : Ty {       Image: instance I : S         22       entities         23       Employee         24       Department         25       foreign_keys         26       manager : Employee -> Employee         27       worksIn : Employee -> Department
22       entities <ul> <li>entities</li> <li>Employee</li> <li>Department</li> <li>foreign_keys</li> <li>foreign_keys</li> <li>manager : Employee -&gt; Employee</li> <li>worksIn : Employee -&gt; Department</li> <li>first(a) = AI</li> <li>first(b) = Bob</li> <li>last(b) = Bo</li> <li>first(c) = Carl</li> </ul>
24       Department       first(a) = AI         25       foreign_keys       first(b) = Bob         26       manager : Employee -> Employee       last(b) = Bo         27       worksIn : Employee -> Department       first(c) = Carl
25       foreign_keys       first(b) = Bob         26       manager : Employee -> Employee       last(b) = Bo         27       worksIn : Employee -> Department       first(c) = Carl
26manager: Employee> Employeelast(b) = Bo27worksIn: Employee> Departmentfirst(c) = Carl
27 worksIn : Employee -> Department first(c) = Carl
28 secretary : Department -> Employee name(m) = Math
30 Employee.manager.worksIn = Employee.worksIn name(s) = CS
31 Department.secretary.worksIn = Department age(a) = age(c)
32 attributes manager(a) = b
33 first last : Employee -> string 24 manager(b) = b
$34$ age : Employee $\rightarrow$ nat manager(c) = c
36 name : Department -> string worksln(a) = m
37 observation_equations worksln(h) = m
<pre>38 forall e. cummulative_age(e) = plus(age(e), age(manager(e))) worksh(b) = h worksh(c) = s</pre>
39 options
40 = prover = comptetion
$\frac{41}{42}$
43 E instance I = literal : S {
65 worksin(a) = worksin(manager(a))
66 age(a) = succ(succ(zero))
age(manager(a)) = succ(zero)
Employees - 12:53:27 AM generators
a : Employee
Computation wall-Clock time: 0,15 b: Employee
c : Employee
m : Department
JVM Used Change: 0 MB. Used Max: 19 MB. s : Department

		Employees - 12:53:27 AM		
ummary		Tables TyAlg Hom-sets DP	Text Expression	
chema S	Department (2)			
nstance I : S	Row 🔺	name	secretary	
	a.manager.worksIn	Math	a.manager	
	c.worksln	CS	c	
	Employee (3)			
	Row age	cummulative_age	first last manager	worksin
	a succ(succ(zero))	(succ(succ(zero)) plus succ(zero)) (succ(zero) plus succ(zero))	<b>Rob Ro</b> a manager	a.manager.worksin
	c succ(succ(zero))	(succ(succ(zero)) plus succ(succ(zero)))	Carl c.last c	c.worksin
	string (2)			
	Row 📥			
	a.last			
	Clast			

#### Friend of a friend

```
constraints works_at_determined1 = literal : FOAF {
forall s:salary ->
exists w:works at
where s.salary1 = w.works_at1
     s.salary2 = w.works_at2
constraints works_at_determined2 = literal : FOAF {
forall w:works at ->
exists s:salary
where s.salary1 = w.works at1
     s_salary2 = w_works at2
constraints frenemy determined = literal : FOAF {
forall fr : frenemy of ->
exists f : friend of
      e : enemy of
where fr.frenemy_of1 = f.friend_of1
     fr.frenemy of 2 = f.friend of 2
     fr.frenemy_of1 = e.enemy_of1
     fr.frenemy of 2 = e.enemy of 2
```

**typeside** Ty = **literal** { types Number String schema FOAF = literal : Ty { entities //entities Person Organization //spans knows friend of works at salary enemy of frenemy\_of foreign\_keys //total functions knows1 : knows -> Person knows2 : knows -> Person friend\_of1 : friend\_of -> Person friend\_of2 : friend\_of -> Person works\_at1 : works\_at -> Person works at2 : works at -> Organization salary1 : salary -> Person salary2 : salary -> Organization enemy\_of1 : enemy\_of -> Person enemy of2 : enemy of -> Person frenemy\_of1 : frenemy\_of -> Person frenemy\_of2 : frenemy\_of -> Person attributes //total functions family name : Person -> String age : Person -> Number given\_name : Person -> String salary3 : salary -> Number constraints knows\_symmetric = literal : FOAF { forall k1:knows ->

exists k2:knows ->
exists k2:knows
where k1.knows1 = k2.knows2
k1.knows2 = k2.knows1



$\mathcal{E}$ lement		Value					
ID	$\lambda$	v	ID	au		Cabel	$\mathcal{T}_{\text{vpe}}$
$t_1$	Trip	$(u_1,u_2)$	Alice	String			
$t_2$	Trip	$(u_1, u_3)$	Bob	String		0	
241	User	Alice	Chaz	String	User	String	String
	User	Roh	$(21, 21_0)$		Trip	User × User	$User \times User$
$a_2$	0.561	DOD	$(a_1, a_2)$				
$u_3$	User	Chaz	$(u_1, u_3)$	User × User			

#### CQL: Further Capabilities

- CQL has over 100 keywords
- Categories, functors, and natural transformations (schema, data)
- Left and right Kan extensions (migration of data)
- Limits and colimits (integration of schema, data)
- Grothendieck construction (data <-> schema)
- Patented implementation techniques: automated theorem proving, custom "chase" algorithms, reduction to SQL.

#### Thanks

- Me: ryan@conexus.com
- <u>http://Categoricaldata.net</u>
- <u>http://conexus.com</u>
- Collaborators welcome!