# Insurance Portfolio Management

Michael Genesereth Computer Science Department Stanford University

# **Insurance** Policies









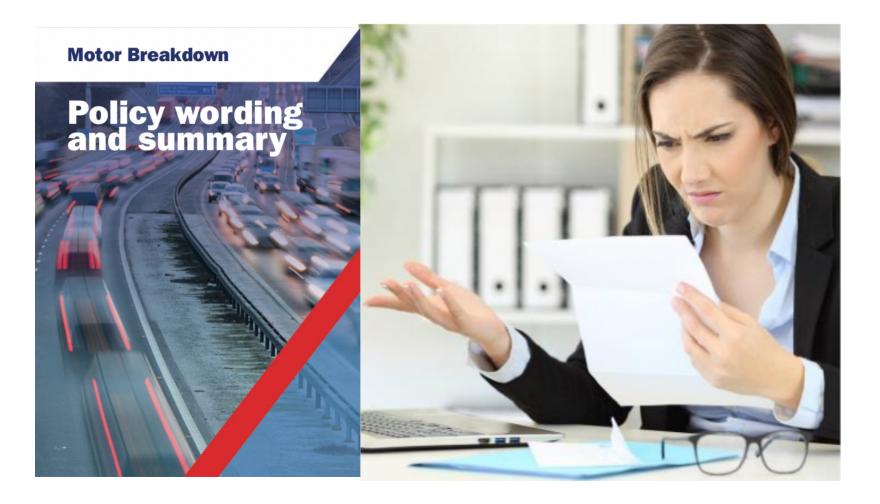
## Insurance Portfolio Management

Insurance portfolio management (IPM) is the process of managing *overlapping insurance policies* with an eye to *minimizing insurance costs* while *ensuring adequate coverage*.

# Example



# **Complexity of Insurance Policies**



Policies are complex, incomplete, inconsistent.



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**Products** Click on the link to **view** available insurance products.



#### People

Click on the link to **view** or **add** people you would like to include on your policies.



**Policies** Click on the link to **view**, **add**, or **analyze** policies.



#### **Properties**

Click on the link to **view** or **add** properties that are insured or that you wish to insure (automobiles, houses, etc.).



### <u>Claims</u>

Click on the link to **view**, **add**, or **analyze** claims.



#### **Events**

Click on the link to **view** recorded events (accidents, fires, etc.) or to **record** new events.



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Products	Policies	Claims	Pe	ople	Properties	Events
]	Product				Insurer	Actions
aflac_hospital_cash				aflac		
axa_travel_policy				axa		€€
calcas_auto_insurance				calcas		
chubb_hospital_cash				chubb		∎€
codex_plana				codex		<b>EC</b>
codex_planb				codex		<b>EC</b>
codex_planc				codex		<b>BO</b>
codex_pland				codex		<b>EC</b>
codex_plane				codex		∎€
codex_planf				codex		<b>EC</b>
codex_plang				codex		
codex_planh				codex		∎€
hertz_rental_insurance				hertz		
lifesecure_hospital_cash				lifesecure	e	
visa_signature				visa		<b>BC</b>



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Proc	ducts	Policies Claim	is Peop	le Properti	es Events		
	Policies						
Policy	Insurer	Туре	Insuree	Begin	End	Actions	
policy1234567821	chubb	chubb_hospital_cash	steve_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
policy1234567822	axa	axa_travel_policy	sally_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
policy1234567831	codex	codex_plana	steve_squirrel	2021_01_01	2021_12_31	<b>⊇</b> <. ∎̂	
policy1234567832	codex	codex_planb	steve_squirrel	2021_01_01	2021_12_31	EQ.10	
policy1234567833	codex	codex_planc	steve_squirrel	2021_01_01	2021_12_31	▤़⊂,∎̂	
policy1234567834	codex	codex_pland	steve_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
policy1234567841	visa	visa_signature	sally_squirrel	2021_01_01	2021_12_31	EQ.	
		•	Add Policy				



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Products	Policies Claim	s People	Properties	s Events	
		Claims			
Claim	Event	Recommend	lation	Justification	
claim21	hospitalization21	decline		<u>Explain</u>	
claim22	hospitalization22	pay		<u>Explain</u>	
claim31	repair31	pay		<u>Explain</u>	
Add Hospitalization Add Repair					



### **Claim Information**

Claim: claim21 🛟 New	
Event: hospitalization21	New
Date: 2021_11_30	

### **Hospitalization Detail**

Patient: sally_squirrel  Diagnosis: sp	orained_ankle					
Hospital: Johns Hopkins Medical Center 💠 Physician: Dr. Kildare 🗘						
Date Admitted: 2021_08_23	Time Admitted: 10:00 pm 🛟					
Date Discharged: 2021_08_24	Time Discharged: 10:00 am 🛊					
WARNING: Your hospital stay was less than 24 hours. You will not be covered for this claim.						
Was hospitalization recommended by a practicing physician? Yes 🗘						
What was the cause of the condition requiring hospitalization? accident21 + New						

#### **Accident Information**

Id: accident21	
Subject: sally_squirrel	
Activity: Dancing 🗘	
Country: usa	
Date: 2021_08_23	

Load Save



### **Claim Information**

Claim: claim21 🛟 New	
Event: hospitalization21	New
Date: 2021_11_30	

### **Hospitalization Detail**

Patient: sally_squirrel  Diagnosis: sprained_ankle						
Hospital: Johns Hopkins Medical Center 💠 Physician: Dr. Kildare 💠						
Date Admitted: 2021_08_23 Time Admitted: 10:00 pm \$						
Date Discharged: 2021_08_24 Time Discharged: 10:00 pm +						
Was hospitalization recommended by a practicing physician? Yes +						
What was the cause of the condition requiring hospitalization? (accident21 ) New						

### **Accident Information**

Id: accident21	
Subject: sally_squirrel	
Activity: Dancing 🗘	
Country: usa	\$
Date: 2021_08_23	

Load Save



### **Claim Information**

Claim: claim21 🛟 New	
Event: hospitalization21	New
Date: 2021_11_30	

#### **Hospitalization Detail**

Patient: sally_squirrel 🛊 Diagnosis: sprained_ankle 🛊						
Hospital: Johns Hopkins Medical Center 💠 Physician: Dr. Kildare 💠						
Date Admitted: 2021_08_23 Time Admitted: 10:00 pm \$						
Date Discharged: 2021_08_24 Time Discharged: 10:00 pm 🗘						
Was hospitalization recommended by a practicing physician? Yes 🗘						
What was the cause of the condition requiring hospitalization? [accident21 ] New						

#### **Accident Information**

Id: accident21 Subject: sally\_squirrel \$ Activity: Skydiving \$ WARNING: Your accident is due to an extreme activity. You will not be covered for this claim. Country: usa \$ Date: 2021\_08\_23

Load Save



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Proc	ducts	Policies Claim	is Peop	le Properti	es Events		
	Policies						
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policy1234567841	visa	visa_signature	sally_squirrel	2021_01_01	2021_12_31	ēq.		

	Provisions						
C	covers(policy1234567831,Z) :- hospitalization.patient(Z,steve_squirrel) & hospitalization.hospital(Y,V72) & hospital.country(V72,usa) & hospitalization.startdate(Z,V73) & hospitalization.enddate(Z,V74)						
C	covers(policy1234567831,Z) :- hospitalization.patient(Z,V80) & person(spouse(V80,steve squirrel) & hospitalization.hospital(Z,V81) & hospitalization.startdate(Z,V82) & hospitalization.enddate(Z,V83)						
	covers(policy1234567831,Z) :- hospitalization.patient(Z,V89) & person parent(V89,steve squirrel) & hospitalization.hospital(Z,V90) & hospitalization.startdate(Z,V91) & hospitalization.enddate(Z,V92)						



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policy1234567834	codex	codex_pland	steve_squirrel	2021_01_01	2021_12_31	eq		
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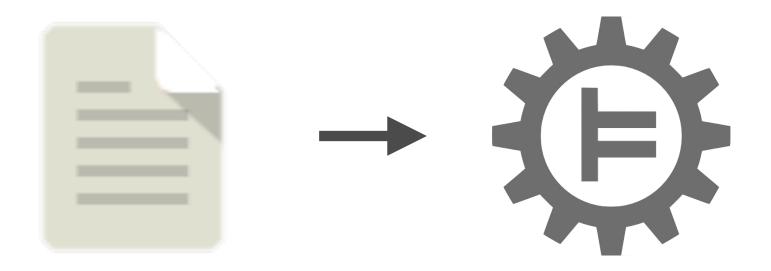
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policy1234567831	codex	codex_plana	steve_squirrel	2021_01_01	2021_12_31	ē9,		
policy1234567832	codex	codex_planb	steve_squirrel	2021_01_01	2021_12_31	EQ.		
policy1234567833	codex	codex_planc	steve_squirrel	2021_01_01	2021_12_31	E.		
policy1234567834	codex	codex_pland	steve_squirrel	2021_01_01	2021_12_31	EQ.		
policy1234567841	visa	visa_signature	sally_squirrel	2021_01_01	2021_12_31	EQ.		
policy1677517451	codex	codex_planh	steve_squirrel	2021_01_01	2021_12_31	ē9,		

Provisions

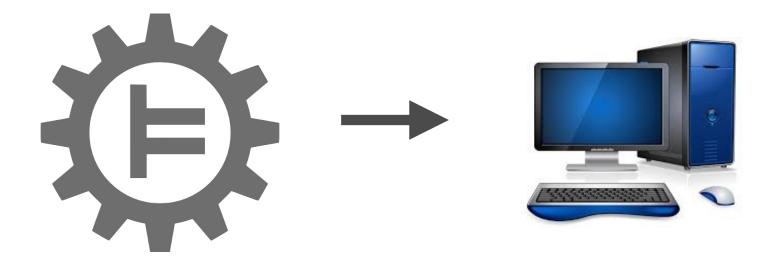
covers(policy1234567841,Z) :repair.vehicle(Z,v1234) &
collision.vehicle(V166,V1234) &
collision.country(V166,usa)

## **Computable Contracts**



## From Textual Policies to Computable Contracts

# **Contract Automation**



## Automating Insurance Processes

# Formal, Declarative Representation

## **Definitions of Concepts (Ontologies)**

A grandparent is a parent of a parent.
grandparent(X,Z) :- parent(X,Y) & parent(Y,Z)

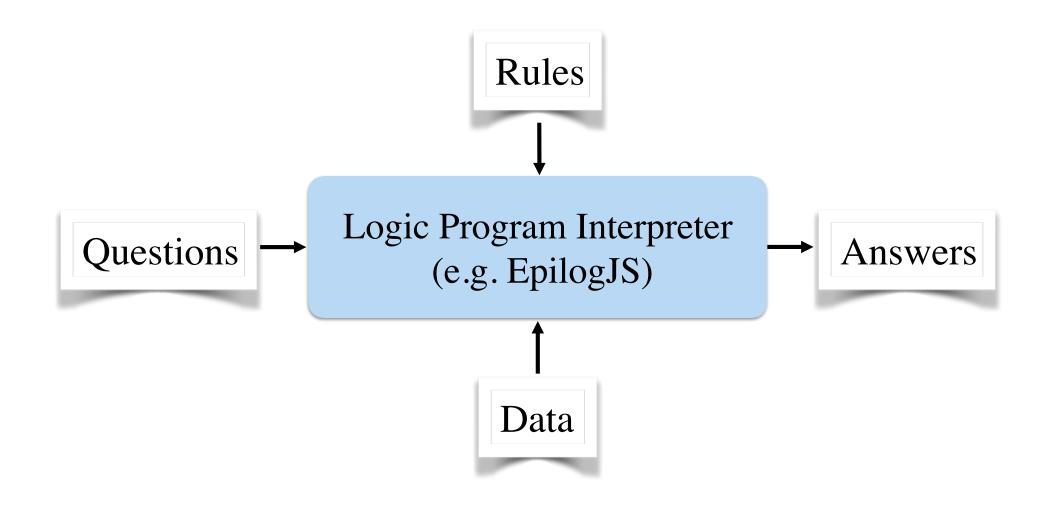
## **Constraints**

Parents are older than their children.
illegal :- parent(X,Y) & age(X)<age(Y)</pre>

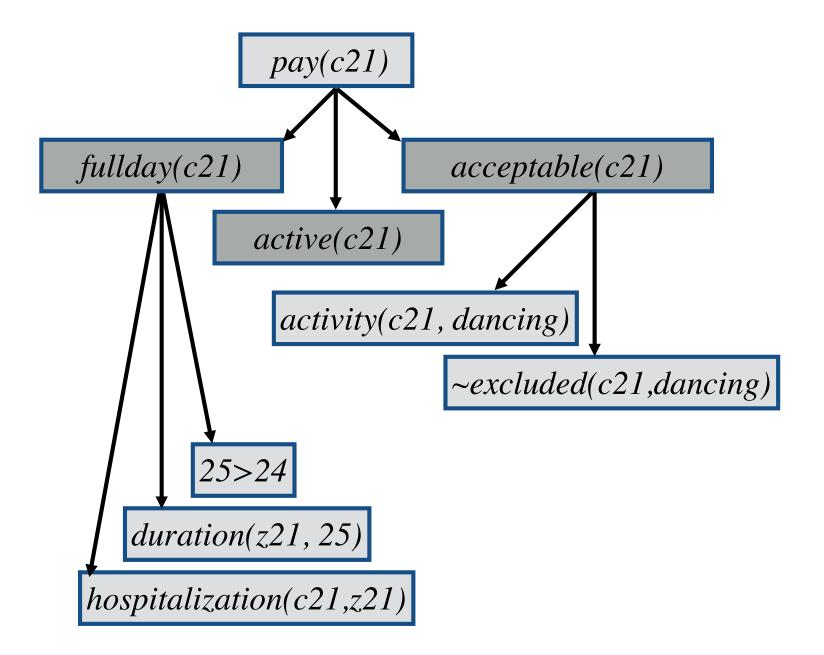
## **Policies - Definitions of Coverage**

Policy 1 covers all hospitalizations in the usa.
covers(policy1,H) := location(H,usa)

# Logic Programming Interpreter



# **Derivation Trees**



# Template-Based NL Generation

## **Templates:**

- fullday(X)

- H>J

- $\rightarrow$  "Claim X is full day"
- hospitalstay  $(X, Z) \rightarrow$  "the hospital stay of X is Z"
- duration (Z, H)  $\rightarrow$  "the duration of Z is H hours"
  - $\rightarrow$  "H is greater than J"

## **Derivation Tree:**

- fullday(c21) :
  - hospitalstay(c21,z21)& duration(z21,25)& 25>24

## **Explanation:**

Claim c21 is full day because the hospital stay of c21 is z21 and the duration of z21 is 25 hours and 25 is greater than 24.

In progress: Pronouns, prepositional phrases, relative clauses

# Contract Definition Language (CDL)

**View Definition Language** (Epilog) terms of coverage in terms of domain concepts definitions of concepts in terms of available data

**Contract / Insurance Ontology** (in progress) offer, acceptance, consideration, etc. premiums, claims, claim lines, deductibles, exclusions



Domain Ontology and Data (in progress) e.g. diseases, drugs, medical procedures, etc. e.g. fenders, radiators, repair procedures, etc. e.g. walls, external water, internal water, etc.

# Contract IDE



# Contractnet

### **Background Datasets**

Geography Hospitals

## **Background Rulesets**

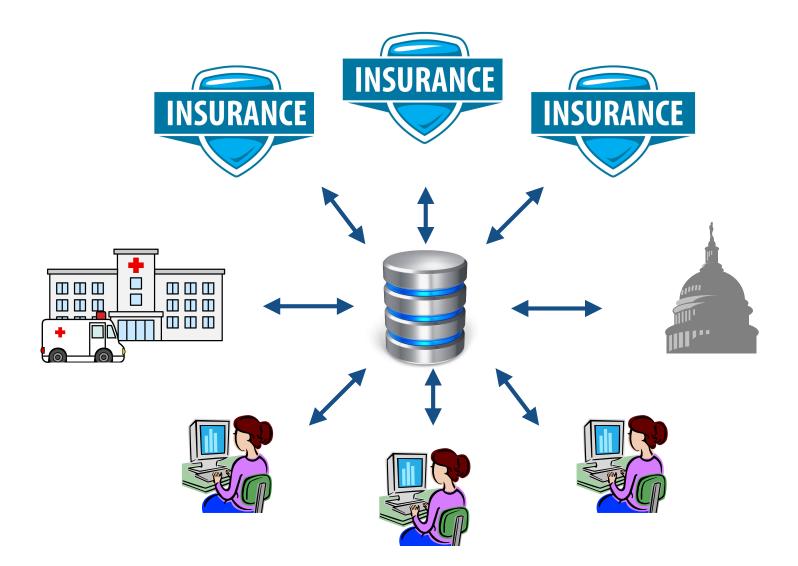
e.g. a week is 7 days e.g. parents are older than their children

## **Open-Source Contract Processing Software**

Compliance checking (EpilogJS) Explaining contractual analysis (ExplainJS, EnglishJS) User Worksheets (WorksheetsJS) Containment Testing and Configuration Aids (TBD)

Github for Computable Insurance Contract Software

# CodeX Insurance Ecosystem





### CodeX Insurance Analyst for Businesses

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#### **Properties**

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### **CodeX Insurance Analyst** for Insurance Companies

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Legal Empowerment through Information Technology

