## SEAL SOFTWARE Intelligent Contract Analytics across Languages and Domains

Svetoslav Marinov

## Overview

- Who are we
- What we do 2 Use Cases
- How we do it
- Enhance core functionality
- Open problems
- Questions

## Who we are

- Founded in 2010
- R&D in Gothenburg, Sweden
- Headquarters in San Francisco
- Offices in London, München, New York
- > 100 employees
- Product: Contract Discovery and Analytics
- http://www.seal-software.com

# What we do

- Where are my contracts and what's in them?
- Automate contract review process
- Adaptable to regulatory changes
- Customizable
- Actionable information
- Scalable
- Data is presented in an integrated and flexible visualization tools
- Flexible platform that evolves as the customers' needs and regulations change
- Across multiple industries Healthcare, Financial Services, Legal Services, High Tech...
- Across multiple language

### Use case

#### The problem:

- A large healthcare provider in the USA aims to have a multi-billion dollar acquisition
- The company they want to acquire has over 1 million contracts
- During Integration of the 2 companies:
  - Novate
  - Identify risky provisions
    - Change of control
    - Assignment
    - Limitation of liabilities
    - Etc
- Go through a vendor consolidation exercise to achieve over \$1 billion dollars in savings

#### The solution:

- Use Seal to discovery all of the contracts of the newly acquired company
- Use the out of the box extractions and Policy creation to extract all of the risky provisions
  - Prioritize the contracts with risky provisions for renegotiation or potential termination
  - See if any of the strategic contracts automatically terminated due to change of control
  - See which contracts have the right to assign, no right to assign or conditional assignment
- Use Seal to recognize overlap in vendors and where one vendor has given better position

### Use case

#### The problem

- One of the world's largest cell phone provider's leases the land under each of its cell towers
- At any given time, the provider maintains 10s-100s of thousands of active leases
- Managing these is a detail oriented and time consuming activity (agreements vary significantly from each other)
- Unmanaged agreements = commercial and legal risks (lease term, renewal, indemnity and termination)

#### The solution

- Seal can discover the lease agreements across the various repositories
- Seal pulls many key lease provisions right out of the box
- Seal analytics to find additional provisions, unique to the customer and their needs
- Contracts in a single place (for future reference)

#### The result

- Analysis of over 600,000 lease related agreements in approximately 3 months
- Identify agreements that required further attention
- Cost savings

### Contracts – some nitty-gritty details

- They come in all shapes and forms (pdf, word, text, scanned, hand-written, on pen-drives, in emails, etc.)
- They come in written in a single language or a in mixture of languages
- They come as single document or many documents in one, or just parts of a document
- Structure and formatting is lost (scans and images)
- Tons of OCR noise introduced
- Extremely varied length and size
- Extremely varied context
- Language obfuscation

### How we do it





Search contracts	-					
Search within All - words.						
Filters						
Assigned To Priority Level Processed Within						
None → Level → Any time →						
Contract Status						
Exclude locked  Near duplicates  Uploaded by me						
Filter By Category						
+ ContractType	•					
+ FileType						
+ GoverningLaw						
+ Language						
+ LinkedContractType						
: : AntiBribery (42)						
ArbitrationBinding (136)						
ArbitrationRules (100) AutoRenewal (126)						
ChangeOfControl (275)						
ConditionalNonSolicitation (31)						
DutyToReturn (238) EC (188)						

Ø "Intellectual property"						
ContractingPar v	Google	×				
Jurisdiction 🔻	new <u>vork</u>	×				
TerminationDate 🔹	2017-01-31	×				
Match All Any of given search conditions. Search within All - words.						

# **Enhanced Core Functionality**

- Custom-specific policies
- Custom-specific rules
- User-Driven Machine Learning (UDML)

# **Custom Specific Policy**

- 1 example (sentence or paragraph) is enough
- Rely on LSI
- Discover all similar clauses throughout the pool of contracts
- Enabled in the system and available to users
- Non-Compete: "In consideration of the benefits provided for in this Agreement...give advice or consultation to any Competitive Business."

## UDML

	Create new	model				×				
Models Note! Model training and deployment							_			~
Residuals	New	Model name	EnvironmentProtectio	on			9	Deploy <b>()</b>	Undeploy 1	Ē
RightsToAssign	New						9	Deploy	Undeploy	Ĩ
RightToAssign	New					Cancel	Create	Deploy (1)	Undeploy (1)	Ĩ
ROFR	New				0	0	Train	Deploy (1)	Undeploy	Ĩ
sfdc_org	New				0	0	Train	Deploy (1)	Undeploy 1	
Termination	New				0	0	Train	Deploy (1)	Undeploy	
TerminationBreach	New				0	0	Train	Deploy 1	Undeploy 1	
TerminationImmediate	New				0	0	Train	Deploy 1	Undeploy	
TerminationInsolvency	New				0	0	Train	Deploy 1	Undeploy	
TerminationNotice	New				0	0	Train	Deploy 1		
TermOfContract	New				0	0	Train 🚯	Deploy 1	Undeploy 1	
+										

# UDML

♀ environment + ×	ffc5c45dad523d901ff255618fb253700cc5559b.json	□ Ready for training ►
Match All Any of given search conditions.	Extractions -	
All contracts	thereof) since the time of incorporation of the Company. At the Closing, the minute books of the Company and each of its Subsidiaries will be in the	
fe8d1a6c3016e0a24efd4d93777bc3a599d26	ossession of the Company. 3.22 Environmental; Health and Safety. The jompany and its Subsidiaries are not in violation of any applicable statute, law.	
feb51b8ee0bc3087477ad0ada365b83eaf996f	or regulation relating to the environment or occupational health and safety, and no material expenditures are or will be required in order to comply with	
fed1146f200832a0c796fd8eb848246497430	any such statute, law, or regulation. 42 3.23 Brokers' and Finders' Fees; Third Party Expenses. Except as set forth in Section 3.23 of the Disclosure Schedule,	
ff09386657fc2dbfd64833a3fdf97794ffed768	the Company has not incurred, nor will incur, directly or indirectly, any liability for brokerage or finders' fees or agents' commissions, fees related to	
ff6f11f55a1ee123db7f75d5dc37ffbf7710ef6d	investment banking or similar advisory services or any similar charges in connection with the Agreement or any transaction contemplated hereby. 3.24	

Imported_Assignable	New		2071	1647	Train	Deploy 1	Undeploy 1	
Imported_AutoRenewal	New		1403	1165	Train	Deploy	Undeploy	
Imported_ChangeOfControl	New		1078	813	Train	Deploy 1	Undeploy	Ŵ
Imported_ContractingParties	New		15482	2497	Train	Deploy	Undeploy 1	Ē

## New Domains and Languages

- Seal provides the necessary tools
- M&A may results in addition of contracts from new domains and/or languages
- Custom policies and UDML enhance OOB core analyzers (to cover new domains, types, regulations and languages)
- Requirements language specific component (Sentences and Tokens) and domain expert

#### **Domain experts**



Domain knowledge Where data is How it should be analyzed One lever – annotate data

"I'm not married to the annotations I make ..."

David Lee Windecher

# Enhancing the system - AL



Source: Burr Settles http://burrsettles.com/pub/settles.activelearning.pdf

# **Open Problems**

- Relations (long-distance, across contracts)
- Learning from low amounts of data
- Learning from highly imbalanced data
- How can we reduce noise in training data?
- What is the best evaluation metric for nondata-scientists?

### Questions

### Thank you!