



ARC v2



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MAVERIC

Introduction

Massachusetts Veterans Epidemiology Research and Information Center (MAVERIC)

About 140 people focused on:

- ▶ Large scale clinical trials (CSP CC)
- ▶ Epidemiology (CSP ERIC)
- ▶ Biospecimen Repository
- ▶ Informatics

Projects include:

- Million Veteran Program & GenISIS
 - Point of Care Clinical Trials
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Background

Growing need for access to EMR data for secondary uses

- ▶ Quality measurement & improvement
- ▶ Comparative effectiveness
- ▶ Evidence-based medicine
- ▶ Bio-surveillance
- ▶ Cohort & registry building
- ▶ Personalized medicine & genomic analyses



The Challenge

- ▶ EMRs were designed for 1-on-1 interactions
- ▶ As a result:
 - ▶ Few widely implemented standards
 - ▶ Questionable quality of these few
 - ▶ Large amounts of free text
 - ▶ Estimated 70% of information in free text
- ▶ In response – 40+ years of 1-off NLP solutions
 - ▶ 113 studies = no systems nor results are generalizable
 - ▶ Stanfill et al. 2010. A systematic literature review of automated clinical coding and classification systems. JAMIA 17: 646-651



The Challenge (cont.)

- ▶ Of the few implemented systems, most are:
 - ▶ Applied for specialized applications
 - ▶ At institutions of origin
 - ▶ Heavily reliant on the systems' developers
- ▶ Why?
 - ▶ Complex nature of the challenge
 - ▶ Many processes involved
 - ▶ Lots of customization
 - ▶ Economics of research



The Idea

- ▶ Change the workflow so that researchers don't have a service-oriented dependency on software developers
- ▶ Move away from rule-based systems to do information retrieval
- ▶ Take advantage of 20+ years of empirical evidence and open source code
- ▶ Use existing NLP frameworks to allow for other developers to extend and modify the tool
- ▶ 90/90 goal using generalized approach



Current Processes of Clinical IR

Developer Tasks

Partition test / training docs

Build schema

Train annotators

Develop algorithms

Evaluate algorithms

Accepted?

Deploy on Collection



End User Tasks

Annotate

Review results



vs.

ARC D.I.Y. Process

Developer Tasks

Develop algorithms



End User Tasks

Provide annotations

Review results

Accepted?



ARC Tasks

Partition test / training docs

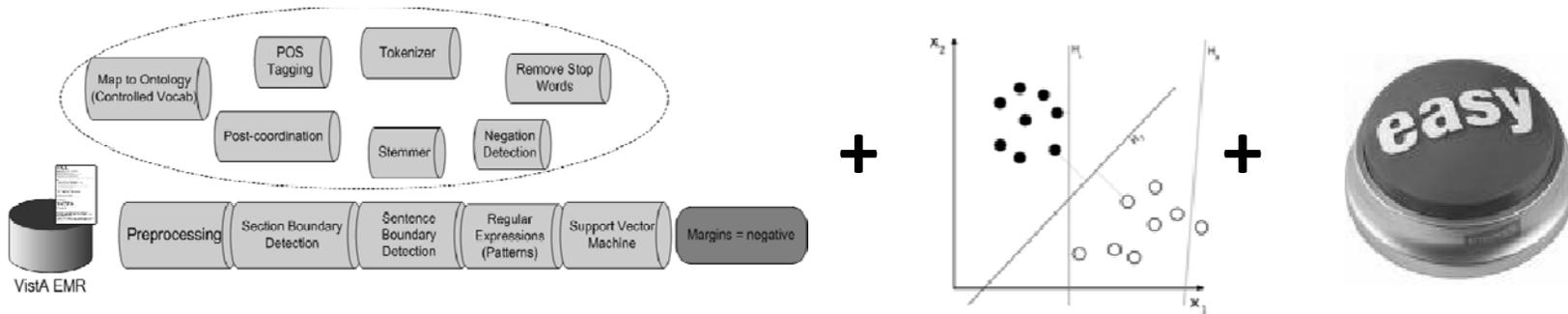
Build schema

Develop algorithms

Evaluate algorithms

Deploy on Collection





- ▶ Import annotations (eHOST and Knowtator)
- ▶ Use existing NLP pipelines (cTAKES)
- ▶ Combine with machine learning (MALLET)
- ▶ Provide a simple workflow taking advantage of powerful tools



Document Retrieval

	Recall	Precision	F-Measure
Prostate Cancer Path Reports	0.97	0.95	0.94
Colorectal Cancer Path Reports	0.90	0.92	0.89
Lung Cancer Imaging Reports	0.76	0.80	0.75
PTSD Psychotherapy Notes (seeking PE)	0.72	0.93	0.81
PTSD Psychotherapy Notes (seeking CBT)	0.86	0.98	0.91
Breast Cancer Path Reports (from 130 hospitals)	0.95	0.95	0.94
Breast Cancer Clinic Notes	0.96	0.88	0.92
Breast Cancer Operative Reports	0.91	0.85	0.87
Pneumonia Imaging Reports	0.80	0.81	0.80



Concept Retrieval (inexact span matching)

	Recall	Precision	F-Measure
2010 i2b2/VA Medical Problems	0.75	0.93	0.83
2010 i2b2/VA Medical Treatments	0.76	0.89	0.82
2010 i2b2/VA Medical Tests	0.76	0.90	0.83

- ▶ 2009 cTAKES with minor changes and a couple of additional annotators (bumper and sentence)
- ▶ 2008 LVG
- ▶ 2008 UMLS
- ▶ Out-of-the box we were on par with average entrants' performance
 - ▶ With less than 5 minutes of human time per task



What we learned

- ▶ Works well on document classification tasks
 - ▶ “Find more cases like these”
- ▶ Use existing structured data to narrow sets
 - ▶ Known ICD-9’s + RXs then use ARC
- ▶ You need to understand how the process works
 - ▶ Training set, test set, performance metrics
- ▶ Know what is “acceptable” & estimated prevalence before you start



Demo

Do-It-Yourself Interface



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- ▶ >150 downloads
 - ▶ Google group, video tutorials, dummy data sets, etc
 - ▶ <http://maveric.org/mig/arc.html>
 - ▶ <http://code.google.com/p/mavericarc/>
 - ▶ <http://groups.google.com/group/ClinicalNLP>
 - ▶ Available on VINCI
 - ▶ Installer package via iDASH
 - ▶ iDASH NLP VM also has ARC
 - ▶ Thanks to HSR&D Consortium for Healthcare Informatics Research (CHIR)

