

CRICOS PROVIDER 00123M

Students: Peter Roush and Bryce Shi

Supervisors: Derek Abbott, Maryam Ebrahimpour and Brian Ng

#### Project 44: Cracking the Voynich Code

**Final Seminar** 

seek LIGHT

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#### Outline

- The Voynich Manuscript
  - Objectives, Background and Motivation
- Analysing the Manuscript
  - Techniques, Research, and Testing
- The Information Learnt
  - Results and Analysis
- Project Management
  - Team Roles, Milestones, and Budgeting
- Conclusions



#### Background, Motivation, and Objectives The Voynich Manuscript

#### A Brief History

- Voynich Manuscript
  - Found in an Italian Castle by Wilfred Voynich, a book collector
  - Pages and some references dated to the 15<sup>th</sup> Century
  - Author or authors unknown
  - Language unknown
  - Pictures have been inconclusively matched to plants in Europe and South America
- Electronic Transcriptions
  - At least two different languages or dialects
  - Hard to separate letters into a fixed alphabet
  - Interlinear Transcription File

#### **Current Theories**

- Early Language or Writing System
  - Early Welsh (Tim Ackerson)
  - Romanised Manchu Chinese (Zbigniew Banasik)
- Code
  - Fake cipher related to Arabic numerals (D'Imperio)
  - Cipher by Roger Bacon (William Newbold)
  - Cipher by Antonio Averlino (Nick Pelling)
  - Certain pages are key to unlocking the mystery (Mark Sullivan)
- Hoax
  - Written to scam money out of Rudolf II (Raphael Mnishovsky)
  - Written by Voynich for money and fame

## Voynich Manuscript

- **Part 1** (Herbal) *129 pages*
- Part 2 (Astronomical)
   *12 pages*
- **Part 3** (Biological) 20 pages
- **Part 4** (Cosmological) *20 pages*
- **Part 5** (Pharmaceutical) *18 pages*
- **Part 6** (Recipes) 25 pages

Detailed chemical analysis can be found at Yale: http://beinecke.library.yale.edu/sites/default/files/voynich\_analysis.pdf



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Characters (EVA Alphabet)

# $\begin{array}{c} \mathbf{G} \\ \mathbf{$

Superif babeo gratiam quorum maiestate sug gerente mibi fauorum opperfici- djksvwxyzi

Humanist miniscule writing (left)

Picture from http://www.afternight.com/runes/a-voynich.gif and dictionarytoday.tumblr.com

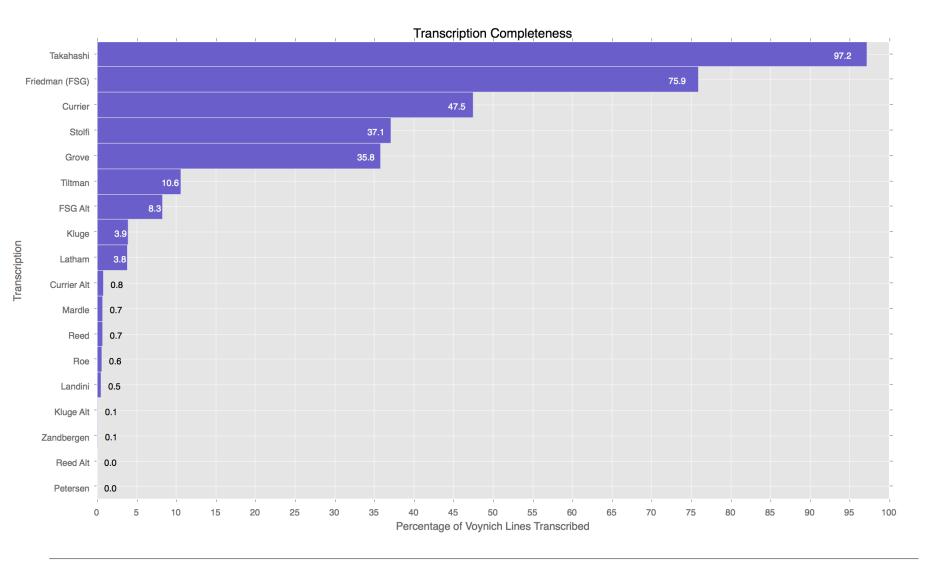
#### Objectives

- Develop Data Mining Techniques for the unknown language/code in the Voynich Manuscript.
- Compare linguistic features of the Voynich Manuscript and other languages.
- Determine whether the language in the Voynich manuscript is real, a code, or a hoax.
- Develop a code base and documentation to aid future projects.



#### Research, Methods and Tools Analysing The Manuscript

#### **Electronic Transcriptions**



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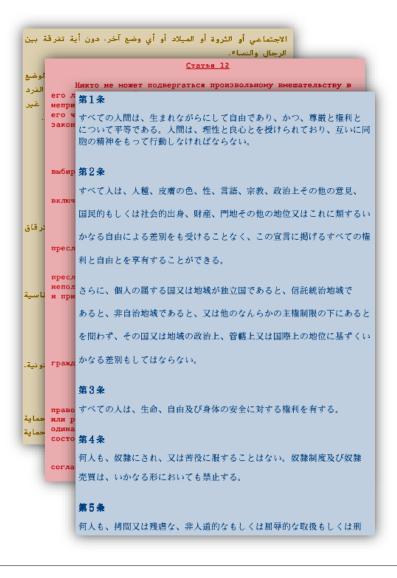
## Testing Methodology

- Used Takahashi Transcription and EVA alphabet for all tests
- Handwritten text files for basic verification
- 10 Comparison Texts of similar length in selected languages
  - English (3 Texts)
  - Latin
  - Italian
  - Hungarian
  - Hebrew (Without vowel accents)
  - Chinese (Simplified Characters)
  - Chinese (Pinyin)

### The UN Declaration of Human Rights

- 382 translated languages
- Allows greater selection of comparison languages.
- Translations contain an average of 1800 word tokens.





#### Collocations

- A collocation is a word combination that occurs more often than would be expected by chance:
  - "Strong Tea"
  - "Friendly Footing"
  - "Saucer of Milk"
  - "Scotland Yard"
- Collocations indicate names and expressions in a language, and don't translate well into other languages.

$$\operatorname{pmi}(x;y) \equiv \log \frac{p(x,y)}{p(x)p(y)} = \log \frac{p(x|y)}{p(x)} = \log \frac{p(y|x)}{p(y)}.$$

#### TF-IDF

- TF: Term Frequency
  - Proportional to the number of times a word is used in a document or section
- IDF: Inverse Document Frequency
  - Inversely Proportional to the number of documents or sections in which a word appears
- TF-IDF scores provide a way to find words relevant to a section, while ignoring words that are common across all sections.

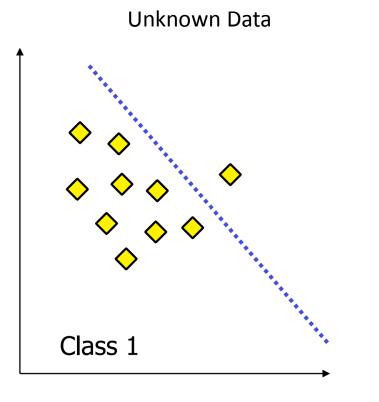
#### Word Recurrence Interval (WRI)

- WRI is defined as the number of words in between successive occurrences of a keyword
- Keyword being: I

I have six locks on my door all in a row. When I go out, I lock every other one. I figure no matter how long somebody stands there picking the locks, they are always locking three.

• Word Recurrence interval is: {0, 11, 2, 4}

#### Support Vector Machine (SVM)



- SVM is a binary classifier
- Defines a decision point from a set of training data which is split into two distinct classes
- Assigns new testing data into one of those classes based on the decision point.
- Can be used for authorship detection

Picture Modified From: Martin Law, 3/1/11, http://www.cise.ufl.edu/class/cis4930sp11dtm/notes/intro\_svm\_new.pdf Reference: Ebrahimpour M, Putniņš TJ, Berryman MJ, Allison A, Ng BW-H, et al. (2013) Automated Authorship Attribution Using Advanced Signal Classification Techniques. PLoS ONE 8(2): e54998. doi:10.1371/journal.pone.0054998

#### Language Investigations (Herbal Book)

- Language and grammar was lax at times
  - Repeated letters skipped
  - Words abbreviated with symbols

#### Position dependent letters

Two different interchangeable versions of letter 's'

#### Different authors, different substitutions

– Separate authors would substitute words with own symbols

#### Penmanship questionable

– Words sometimes written as one word sometimes split apart

#### Words continued on different lines

Occasionally would have an indicator to show word had been split

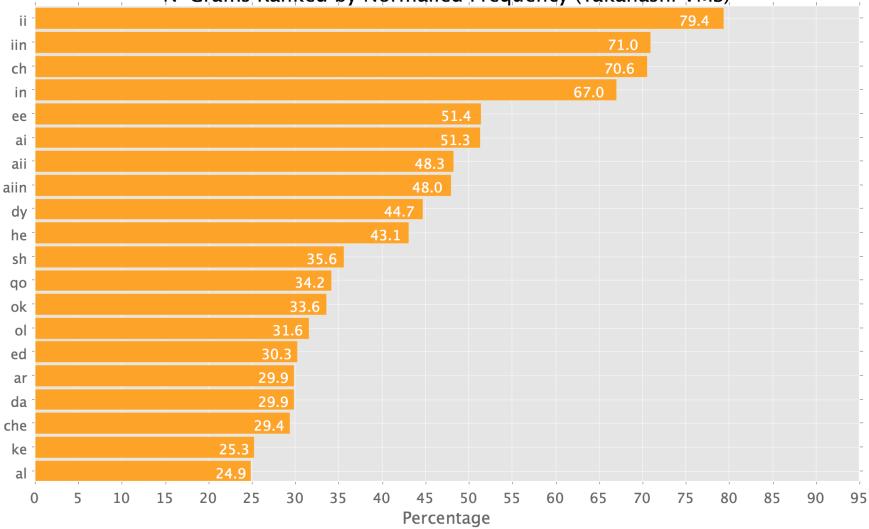


#### Results and Analysis Information Learnt

Section	Currier Language	Pages	Tokens	Words	Words per Page	Full Alphabet Length	Common Alphabet Length
Cosmological	Unknown	20	3008	1521	150	27	24
Biological	В	20	6917	1549	346	21	18
Herbal A	А	97	7956	2492	82	32	21
Herbal B	В	32	3442	1349	108	23	20
Recipes	В	25	11417	3328	457	29	19
Pharma	А	18	2573	1139	143	21	19
Zodiac	Unknown	12	1331	808	111	20	19
Unclassified	Unknown	12	1276	708	106	28	24
Missing		20	0	0	0	0	0
Full Manuscript		256	37945	8105	161	47	21

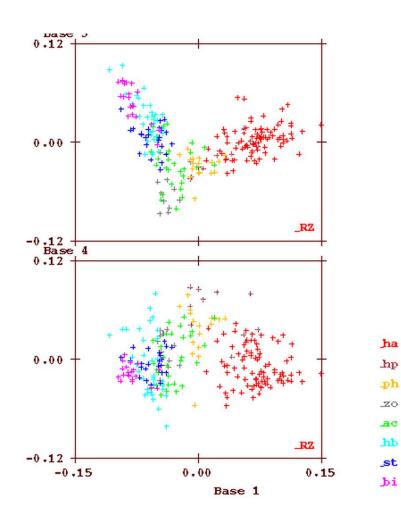
#### **Common Letter Combinations**

N-Grams Ranked by Normalied Frequency (Takahashi VMS)



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#### Word and Illustration Relationships



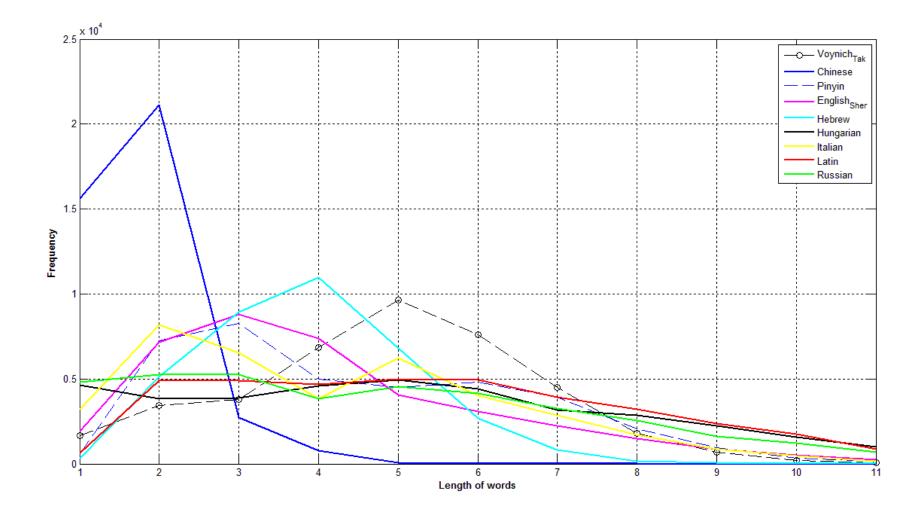
OFCC9 2016 BAN ZC9 SCFCC89 ION FORAL BAL FAN 2001 EPAN OR BICC9 EX2 FAL KORC039 FAR 501 B AN 2009 40FCC9 FOR FCCOR BAR FCS 300 BSG8 SX9 EZC89 OFCC98 FORAL OESC99 JAL 550 OFC5 SC9 FORAL ONAL FORAL COMP FCC98 JAN ONAL 2AM OPC59 BSCARA INE ZAE OWN SRA I ESC9 SC0 AUGUSTAN ZC09 E SFA FCINS SOF SCG4 EPC89 OFC6 VICA 40FC589 OFC68 FORAL BARGE OFT69 FORAL BARGE OFC69 FORAL BARGE
2005 SE FCC9 40PAN OFAN 40PSIS OPCC9 EXCE EFC89 40FC00 AE SCBAN EFCC89 ZOE SOE OEAN ZCBAE 40FAM 9 SODE EFC9 40BSC9 OFS9 SCAE
AEOE ZCAR ONAM 40XC9 NAV OFC8AE SCOC9 40PCC2 ZC8AJ OFCCC89 40XC89 SCXC9 ENCOR 2AEFCC89 PCC89 SXC89 PCC9 ZCFCC9 ZCCC0 ZCAE ON 40FCAR SR INA EAJ 8ZCC89 INSCO 20X SQ19 E0FCC89 ER SXAE KOPSCH ESC0E SC8AR ONAV 40PSC9 AT OIF19 40SC9 0EFAE 8ZC9 PAIL EFO
EFCC9 200 AEOJ FCC0E 40FCSC89 00AM ZCFAE 8SC8 40VSC89 S089 40FC0E ESC8 SFCC9 8SCC9 E0FAJ 40F 0FCC0E SC8SC89 80M ZCCX9 PC9 0PC8AR 0PC2 40FCS9 0PC089 80088 40FC089 0PCC8 AK EVS9 SAM PAT CCC2 0J EFAJ FCCC9 SC02 8AK ZCCF E0P9 ZCFAN 40FCCS9 0FCAE
EFCC089 ZC08 ZC8AN BSAE OPCAE OPCCA140AN 408 1000 SC0 SC0FCC9 AEAJ OFCCO EFCSC9 EFCSC99 SCCFAN OPCCC9 EFAT ESAE OPCC0E S0 FCSC99 0EFCCC99 40FC08 40SC99 OPC0 ZCC08AR SC0J OPARAE 0AM OEFCC0 EFCC9 EFAE EFCCC9 PC8AJ 0FC8AN ZOF 40FCC0E 40FC0C02 OPCC8AN EFCCC99 SCAJ SCXC8 OSC9 FSC9 SC058SAR AIIB SCPAE29 4CCAE 40FCCA2 SC0FC99 ZCCF29 S0FSC9 SXP9 SSCC08AN PCC0AR ACC29 0EAJ AIF9 ZFAM 8ZCC0 OPSC8C9 OPCC9ET 40ZC0 SSCR8A FFCC029 SSCC69 OPC0AD SSAJ 0FC08AN ZCP
ZCOPAJ ZPAR OESCO89 ZCQC9 ESCOCFAJ 40FCC080R SCQ89 40PC8E EOC89 SC8C9 EFAK O'OR F88CC89 ZCCP SC0P989 ZCC0 PSC8 FC0QC89 40FCZC9 FCCZ089 OFCSC89 ESR 20 AEAE O'AR 20AM OPC08AM 40PCC8AM ZCOFAR RF9 SPAR 40TAN ZCOPSC89 ZFC9 40FCAN
ZFC089 82CC0PC09 PCAR SOEFCC089 ESC589 40CCC0 SC8A FCC08AE PC0 0FC0J 40FCC08 EFC8EFC9 PCC8 9SC8E B0EAE B9FC0R SCC9 OBSC8AE EVSC89 ESCC0E 0PC0N SCALAR 40FC0FC89 0PCC0EFC09 EAN 40FCCAE 40FCCE SC89PC0FAN EFC8AR EFCC8AN 0FCAI PCCEFC8AN

EPCCAE U OFCCC2C9 OESAE 4CCAR BOCOFCC9 PCBAN SCBSAJ 40FCCOFAN FCCE BOEFCCO SCOFCAN I\*AR \*AN 9ZC OFZ89 ZFCC9 SXAM

#### Words and Illustration Relationships

Astrological	Biological	Cosmologic al	Pharma	Recipes	Herbal
osar	qol	V	daiin	qokeedy	Daiin
oteody	qolkeedy	ytaiin	okeol	qokaiin	chor
oteotey	qokedy	k	ctheol	lchedy	cthor
eody	qokain	{&169}	olchor	lkaiin	ctho
okalar	shedy	{&171}	qoor	lkain	qotchor
okeodaly	lchedy	х	shockhey	qokain	qotchy

#### Word Lengths and Frequency



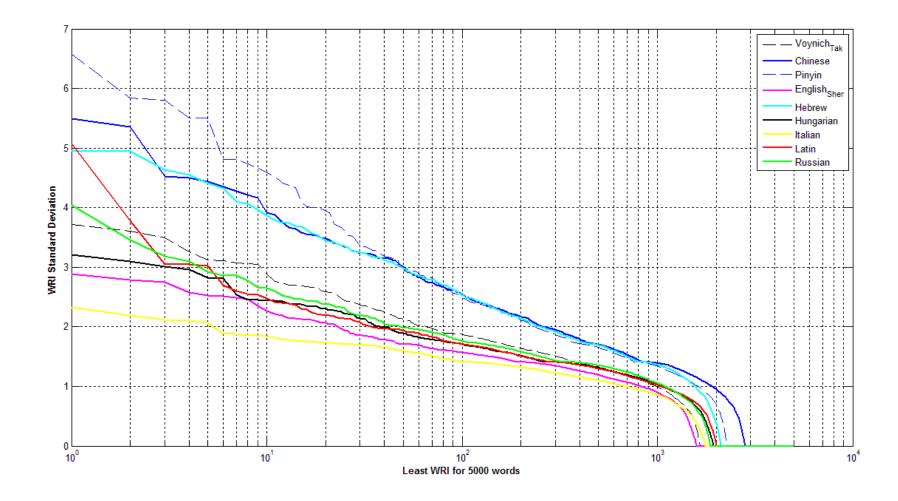
#### UDHR and Word Lengths

Text	Tolerance	Match	UDHR Match	Peak Length
Voynich	10%	45.45%	Arabic, Standard	2
Voynich	15%	54.54%	Arabic, Standard	2
Voynich	25%	63.63%	Malay (Arabic)	4
Voynich	40%	72.72%	Hebrew, Malay (Arabic), Guarayu, Arabic (Standard)	4, 4 5 2
Voynich	50%	81.81%	Arabic (Standard), Hausa (Niger), Hausa (Nigeria)	2 2 2

#### Voynich:

1	2	3	4	5	6	7	8	9	10	11
4.13%	8.52%	9.45%	17.01%	23.95%	18.84%	11.12%	4.49%	1.68%	0.52%	0.14%

#### WRI and Rank Plot

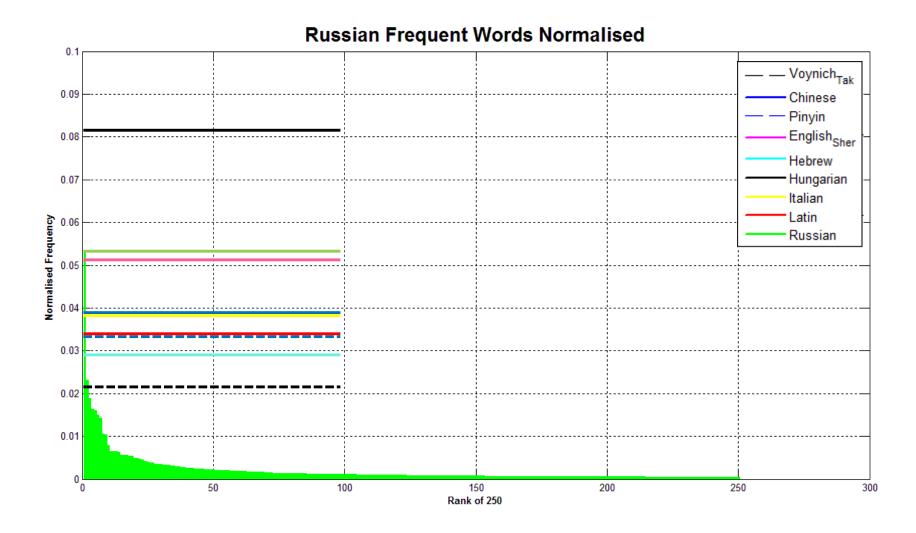


#### UDHR and WRI

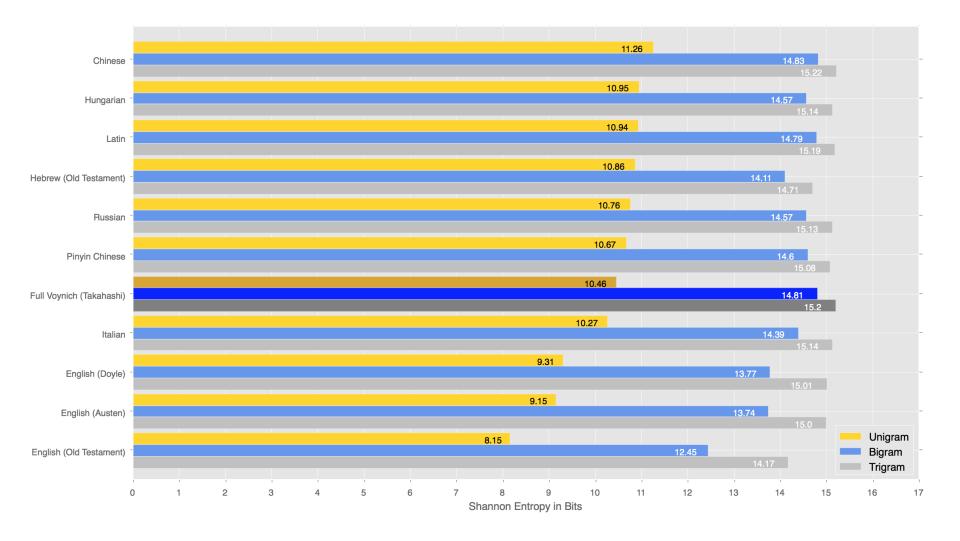
Name	Tolerance	Match	UDHR Match	Comments
Voynich Herbal A	10%	17%	Bosnian (Latin)	f15r - f22v
Voynich Herbal A	10%	12%	Jola-Fonyi	f3r - f10v
Voynich Biology B	10%	3%	Hmong (Southern Qiandong), Aceh	f83r - f85r1
Voynich Recipe B	10%	22%	Bosnian (Latin), Mapudungun	f113r - f114r
Herbal Book	10%	8%	Hmong, Southern Qiandong	16 <sup>th</sup> Century

- Comparison text of ~1500 words
- Average UDHR text length is ~1800 words
- Top 100 data points

#### Word Frequency and Zipf's Law



#### Word Entropy

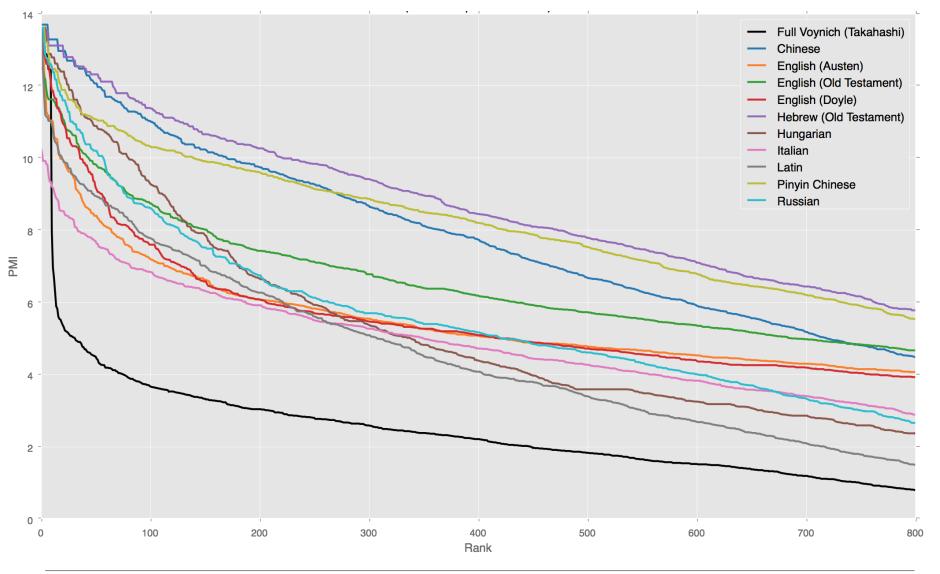


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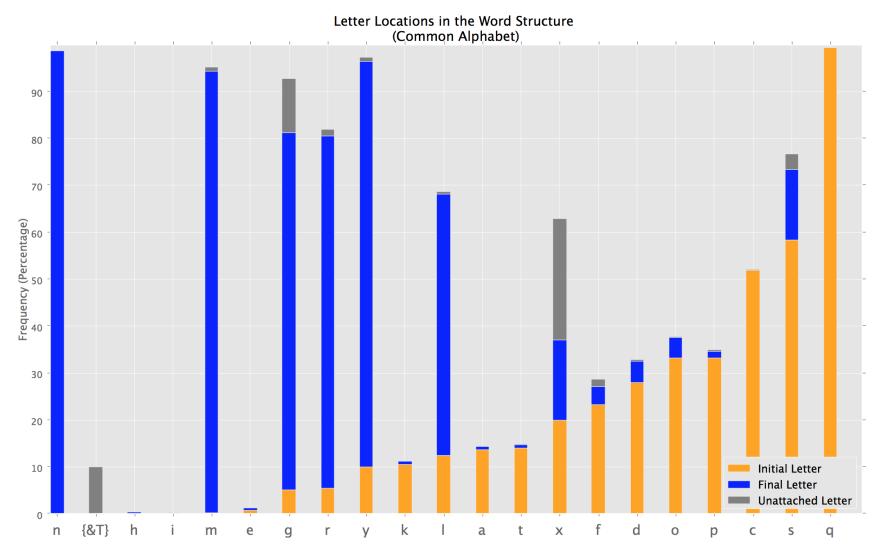
16/10/2014

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#### Collocations



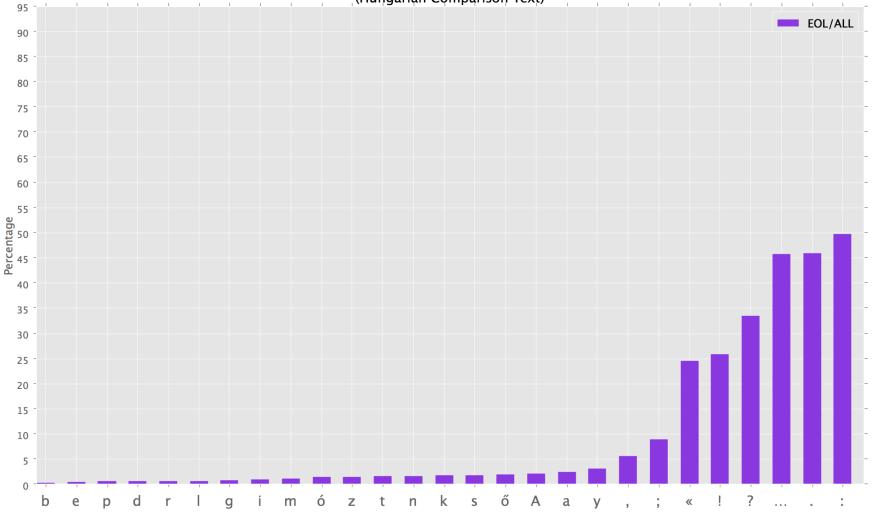
#### Word Structure



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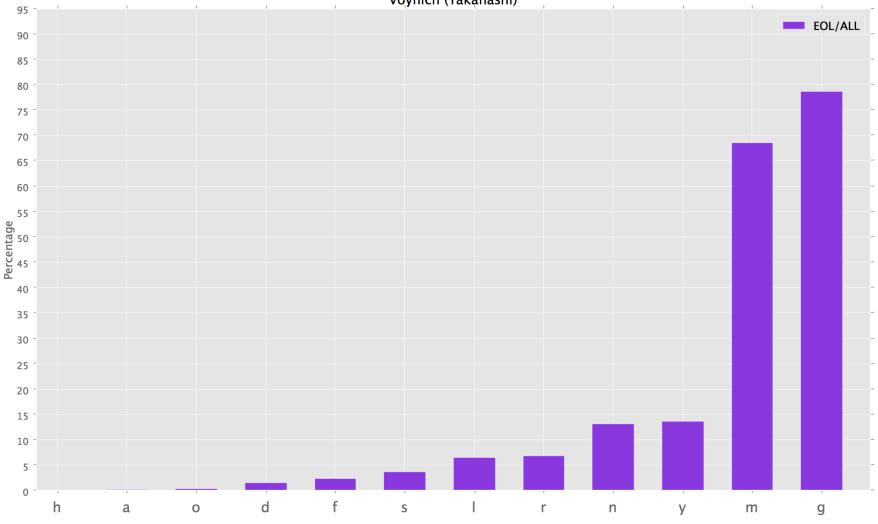
#### Punctuation

#### Significant End of Line Characters (Hungarian Comparison Text)



#### Punctuation

#### Significant End of Line Characters Voynich (Takahashi)



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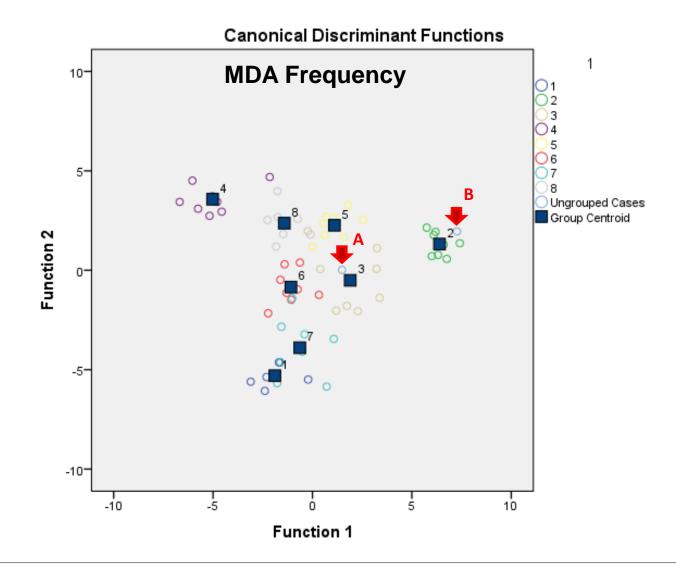
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## Support Vector Machine (SVM)

Language	Comp	arisons	Group									
Voynich <sub>Takahashi</sub> Norm	alised Freq	uency	Hebrew									
Voynich <sub>Takahashi</sub>	σ Ν	WRI Russ										
	Normal Langu	ages Compared										
Chinese	English Sherlock Holmes	Hebrew	I	Hungarian								
Italian	Latin	PinYin	Yin Russian									

Language	Com	parisons	Group
Voynich <sub>Takahashi</sub> Herl	bal A Free	quency	Zodiac
Voynich <sub>Takahashi</sub> Herl	pal A N	WRI	Pharmaceutical
	Voynich Lang	uages Compared	
Biological	Cosmological	Herbal A	Herbal B
Pharmaceutical	Recipes	Unknow	n Zodiacs

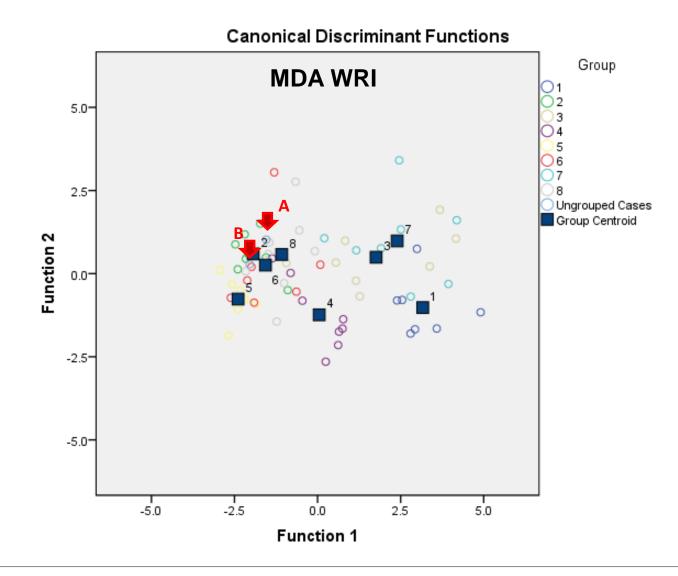
#### Multiple Discriminant Analysis (MDA)



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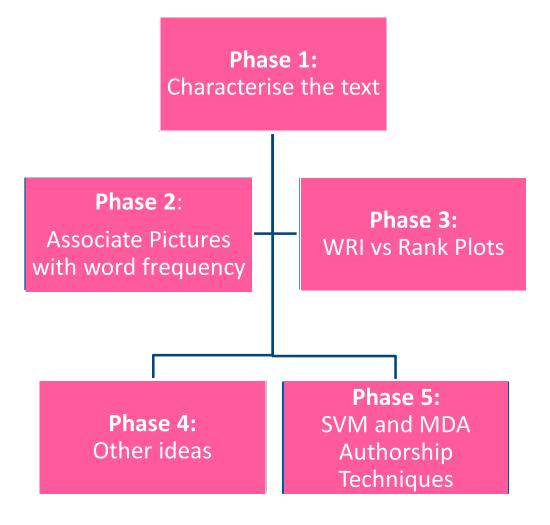
## Risk Management, Budgeting, Timeframes and Approach Project Management

### Risk Management and Budget

No.	Risk	Likelihood	Consequence	Risk Level
1	Not understanding the project correctly and the processes required	Almost Certain	Moderate	Very High
2	Inaccurate allocation of time and resources to a particular area	Likely	Major	Very High
3	Health issues due to long periods of time sitting and working at a PC	Likely	Moderate	High
4	Files and working copies lost	Rare	Major	Medium
5	UofA Electrical Engineering server down for unknown reasons	Unlikely	Moderate	Medium
6	Not being able to solve the Voynich Manuscript code	Almost Certain	Negligible	Medium

• \$396.46 (Spent on 3 books, printing and lamination)

#### **Final Approach**



#### **Team Roles**

- Peter
  - Python Code
  - Phase 2
  - Phase 4
  - Compilation of testing material
  - Research as necessary
- Bryce
  - MATLAB Code
  - Phase 3
  - Phase 5
  - Analysis of known 15<sup>th</sup> Century Text
  - Research as necessary

#### **Project Progress**

	<	< 2014																															
task		March			April				М	lay				June	•			July			A	lugu	st		Se	epte	emb	er		0	ctob	ber	
		11	12	13	14 1	15 10	6 1	7 1	8 1	19 20 2		1 22	2 2	3 2	24 25	5 26	27	28	29	30	31	32	33 3	34 3	35	36	37	38	39	40	41	42	43
▲Phase 1: Characterise the VMS																																	
Create Testing Files																																	
IR on Testing Procedure and VMS Versions																																	
Write and Test Phase 1 Scripts																																	
Run scripts on VMS																																	
Plot Results																																	
IR on Phase 1																																	
Proposal Seminar			-	•																													
Phase 2: Pictures vs. Word Frequency																																	
IR on picture descriptors in VMS																																	
Write and Test Phase 2 Scripts																																	
Plot Results																																	
IR on Phase 2																																	
▲ Phase 3: WRI vs. Rank Plots																																	
IR on Theory beind WRI vs Rank Statistics																																	
Write and Test Phase 3 Scripts																																	
IR on Phase 3																																	
▲ Phase 4: Other Ideas																																	
KR: Critical Review of Previous VMS Studies																																	
Extend Test Suite																																	
Write and Test Phase 4 Scripts																																	
IR on Phase 4																																	
Semester 1 Progress Report														/								Ī											
Exhibition Abstracts																						$\checkmark$											
▲Phase 5: SVN and MDA Authorship Techniqu																																	
IR on VMS History/Mystery																																	
Extend Test Suite																																	
Use Existing Software to Compare with Te																																	
IR on Phase 5																																	



Interpretation of Results
Conclusion

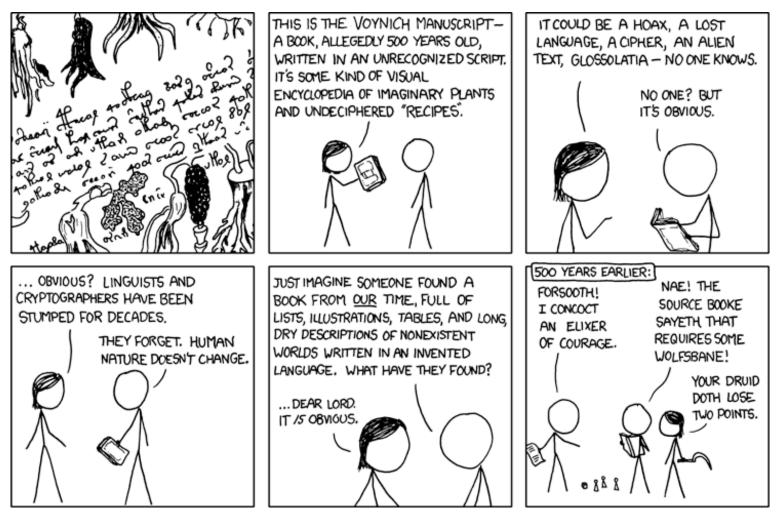
#### Conclusions

- The writing and language in the Voynich appears to have evolved over time, making analysis difficult.
- There is a relationship between language and section, but this may not have anything to do with illustrations
- Based on characteristics such as word length distribution and WRI, appears similar to languages such as Hebrew and Latin
- May contain punctuation, based on line characteristics.
- Weak word order, indicating lack of phrases and proper nouns, or perhaps indicating the characteristics of a code

#### **Future Pathways**

- Expand research into word/illustration relationship
- Test the effect of modified alphabets
- Expand research into authorship if possible
- Hidden Markov Model classification of text
- Develop a rule-based grammar for the the Manuscript if possible
- Test characteristics against transcriptions of known 15<sup>th</sup> century codes

### Questions?



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