

Fig. I.

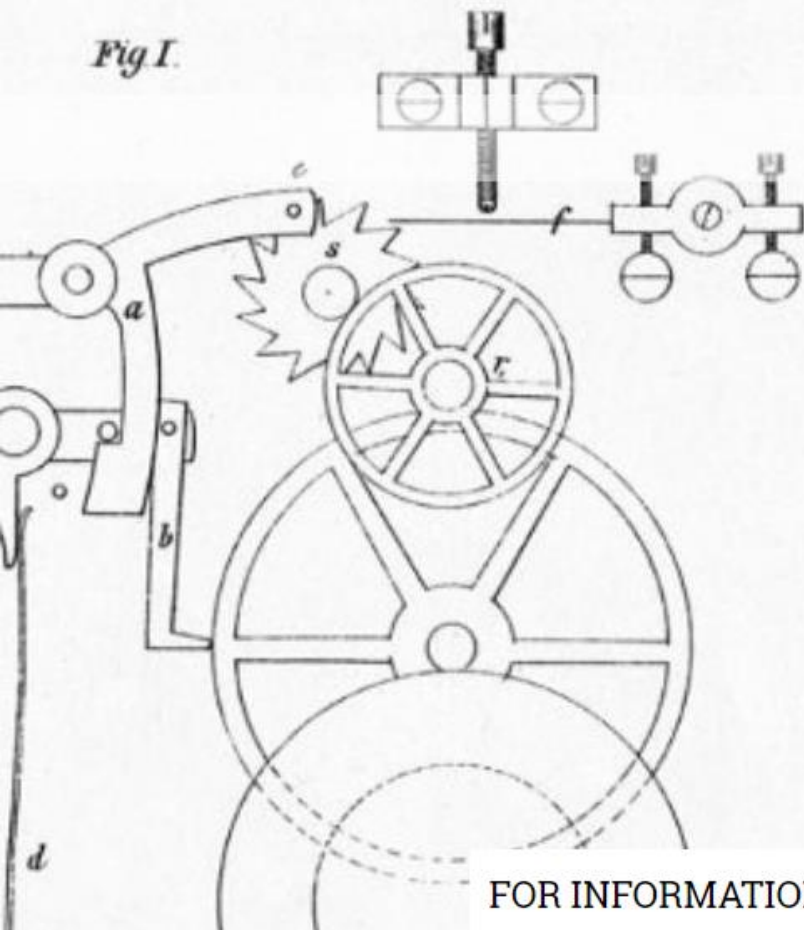
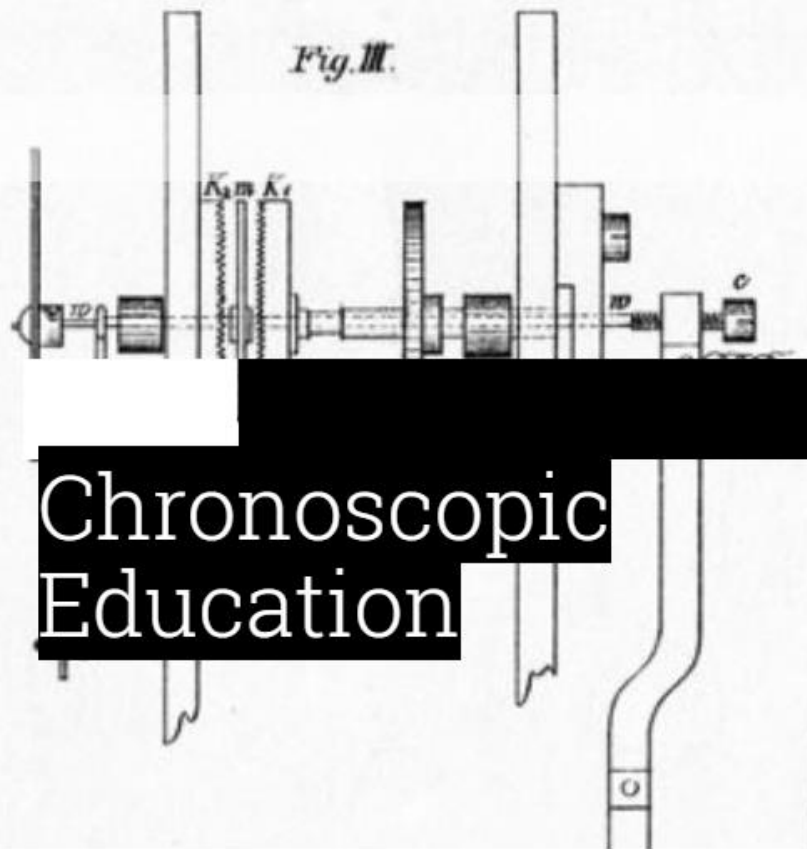
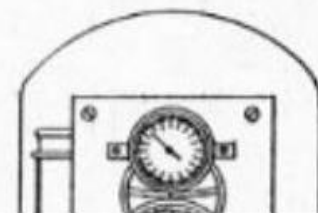


Fig. III.



Chronoscopic Education

Fig. V.

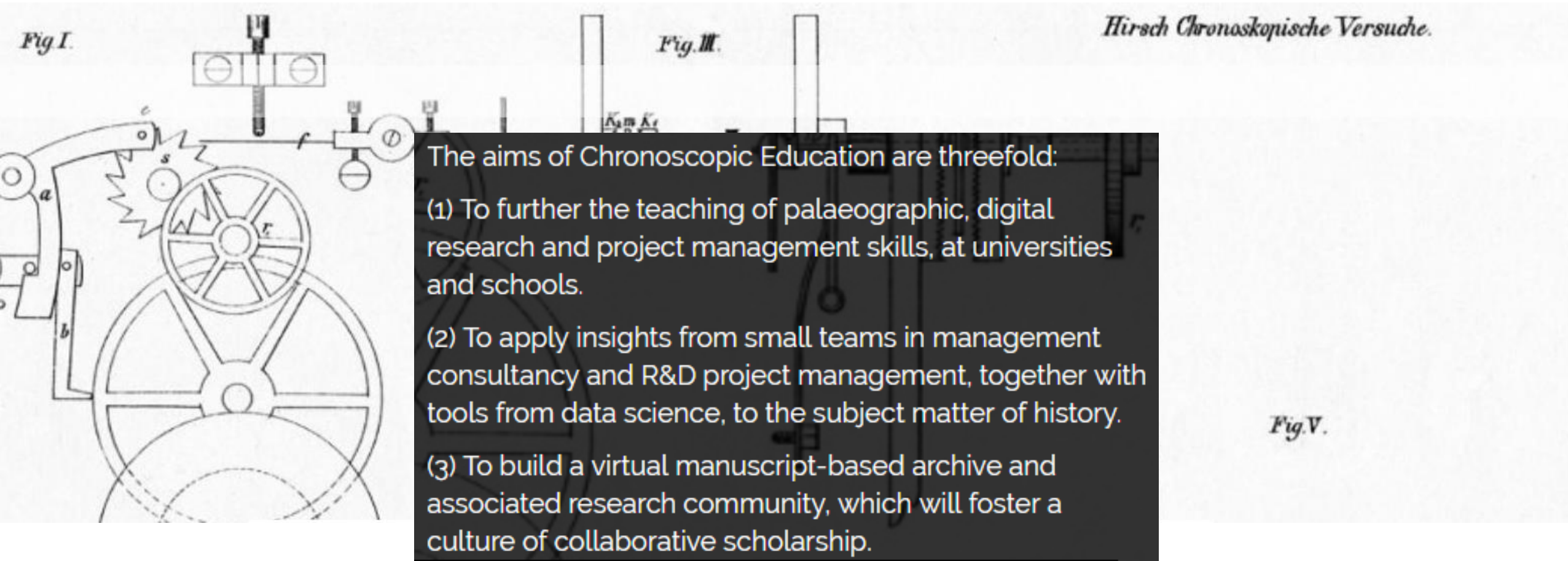


FOR INFORMATION ABOUT OUR OUR AIMS AND OUR PROJECTS



Signs of Literacy
Kaggle Research Competition
Colin Greenstreet
Tuesday, June 26th, 2018

Our social aims



Project portfolio

MarineLives



Signs of Literacy



Maphackathon



EM Textiles, Garments & Dyestuffs Glossary



EM Maritime & Mercantile Gazetteer



Signs of Literacy Kaggle Research Competition, Nov 2018 – Jan 2019



Google owned Kaggle has selected us as one of a small number of pro bono competitions they support each year on the merits of our proposal, and the potential impact on the research field and community of the competition.

Kaggle will cover the running costs of the competition. We will provide the prize pool, and are now seeking to raise US \$30,000 from potential sponsors and partners.

The Proof of Concept will contain two parts:

- (1) Algorithmic identification of markes, initials and signatures.
- (2) Algorithmic discrimination between degrees of "sophistication" within the three categories of "marke"; "initial(s)", and "signature".

Having proven the concept, we will seek out an image or vision oriented computational laboratory with which to develop a grant funded collaboration to take the work further in 2019 and beyond.

User requirements

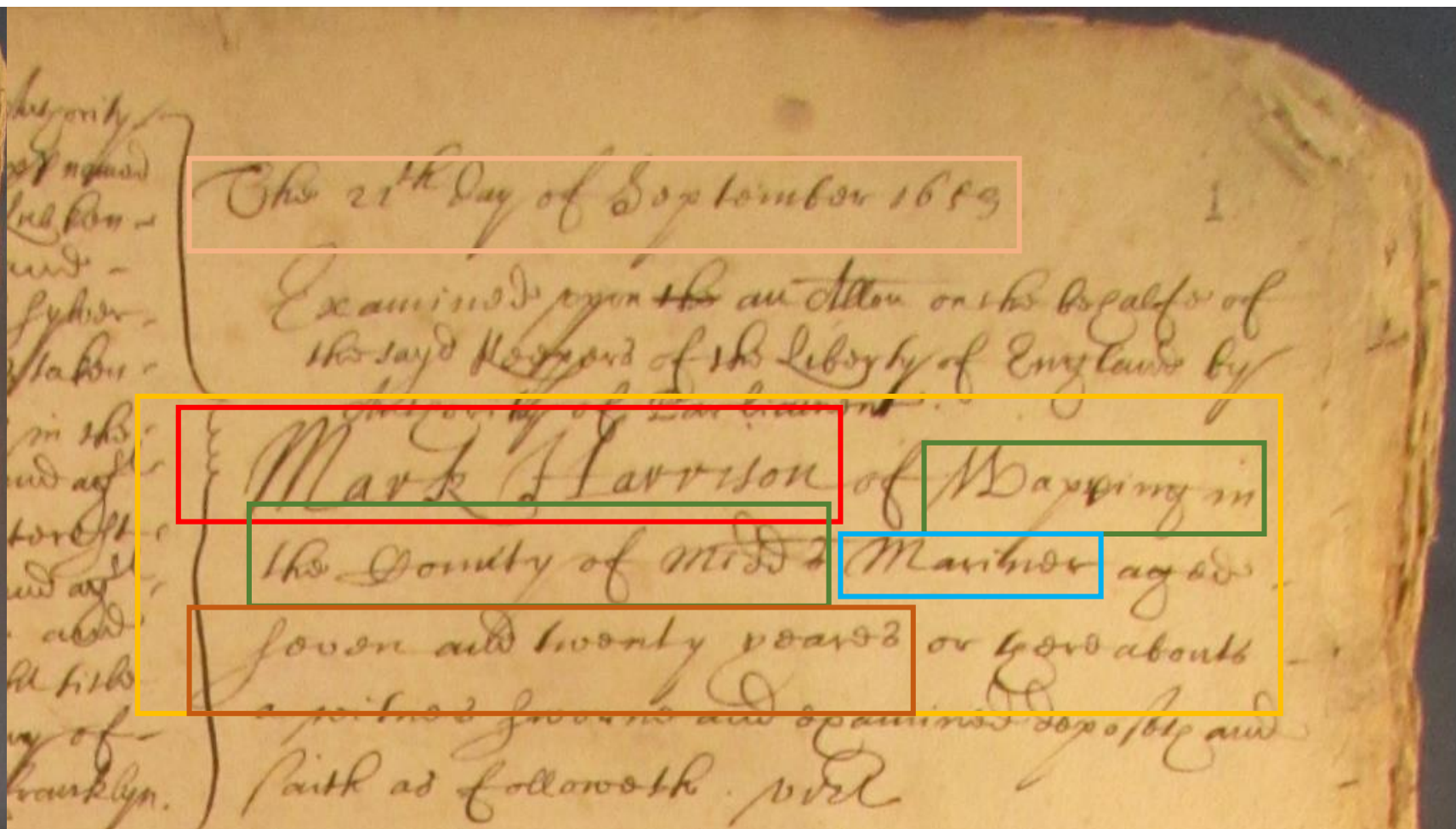
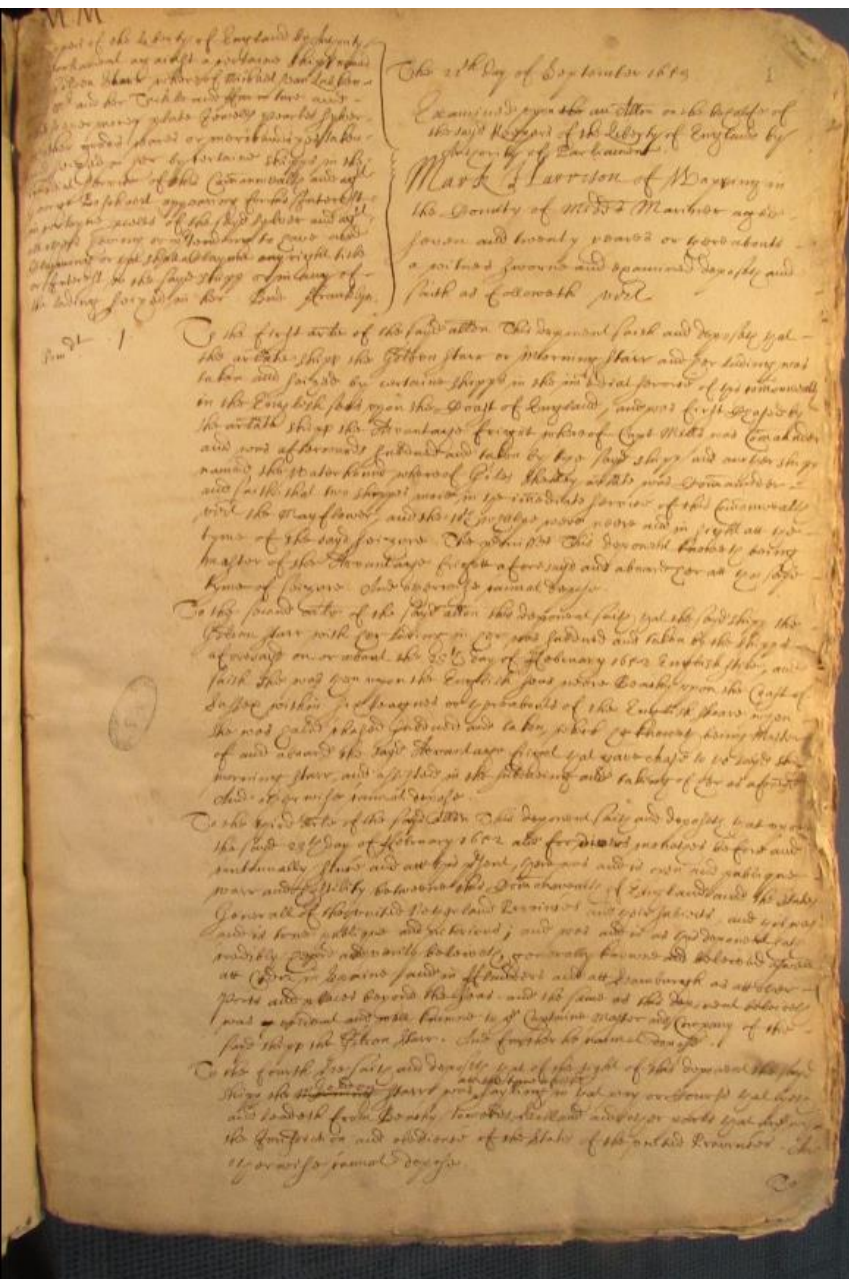
- Automatic identification of manuscript pages containing signoffs
- Markup of manuscript pages to isolate signoffs (markes, initials, signatures)
 - Hand markup of manuscript pages, but ideally automated markup
 - Signoffs can be single or multiple, for single or multiple depositions
 - Deponent signoffs; interpreter signoffs
- Automatic differentiation between classes of markes, initials and signatures
- Automatic differentiation within each class as to sophistication of execution & other parameters as a surrogate for literacy
- Automatic identification of manuscript pages containing deponent metadata (name; age; occupation; place of residence; date of deposition)
- Markup of manuscript pages to isolate deponent metadata
- Hand writing text recognition of deponent metadata and associate metadata with correct signoff
- Geo-referencing of signoffs
 - Display signoffs and/or manuscript pages containing signoffs by georeferences

Legal deposition

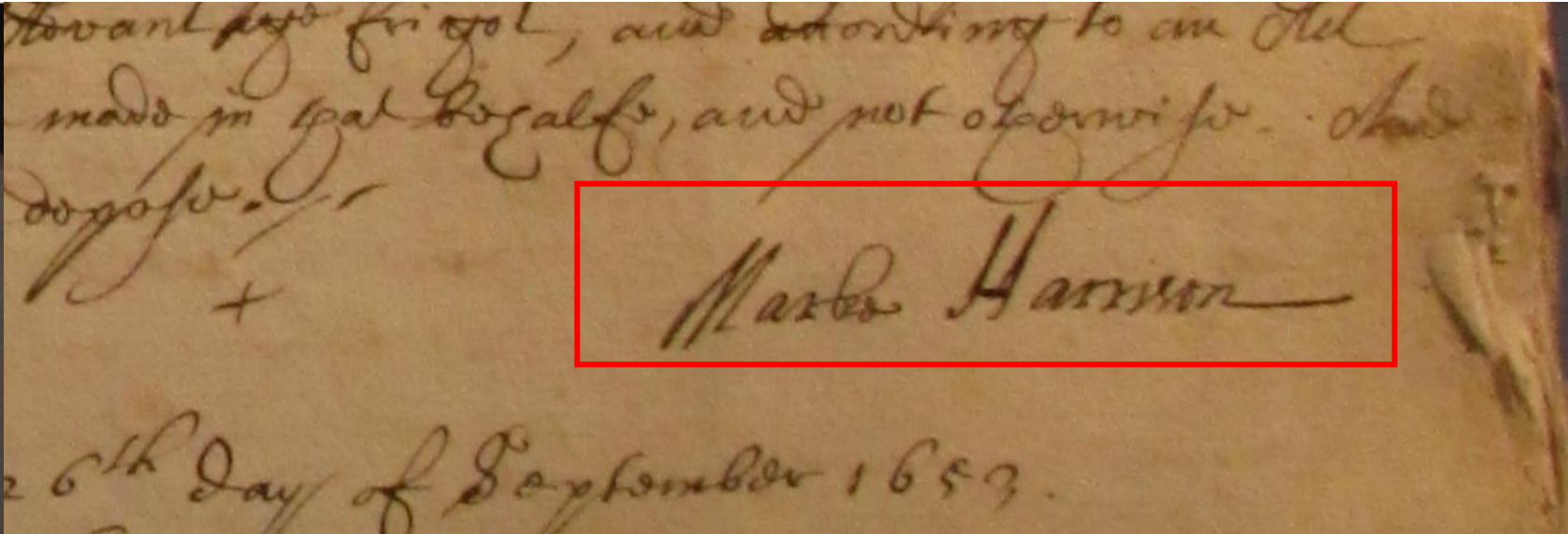
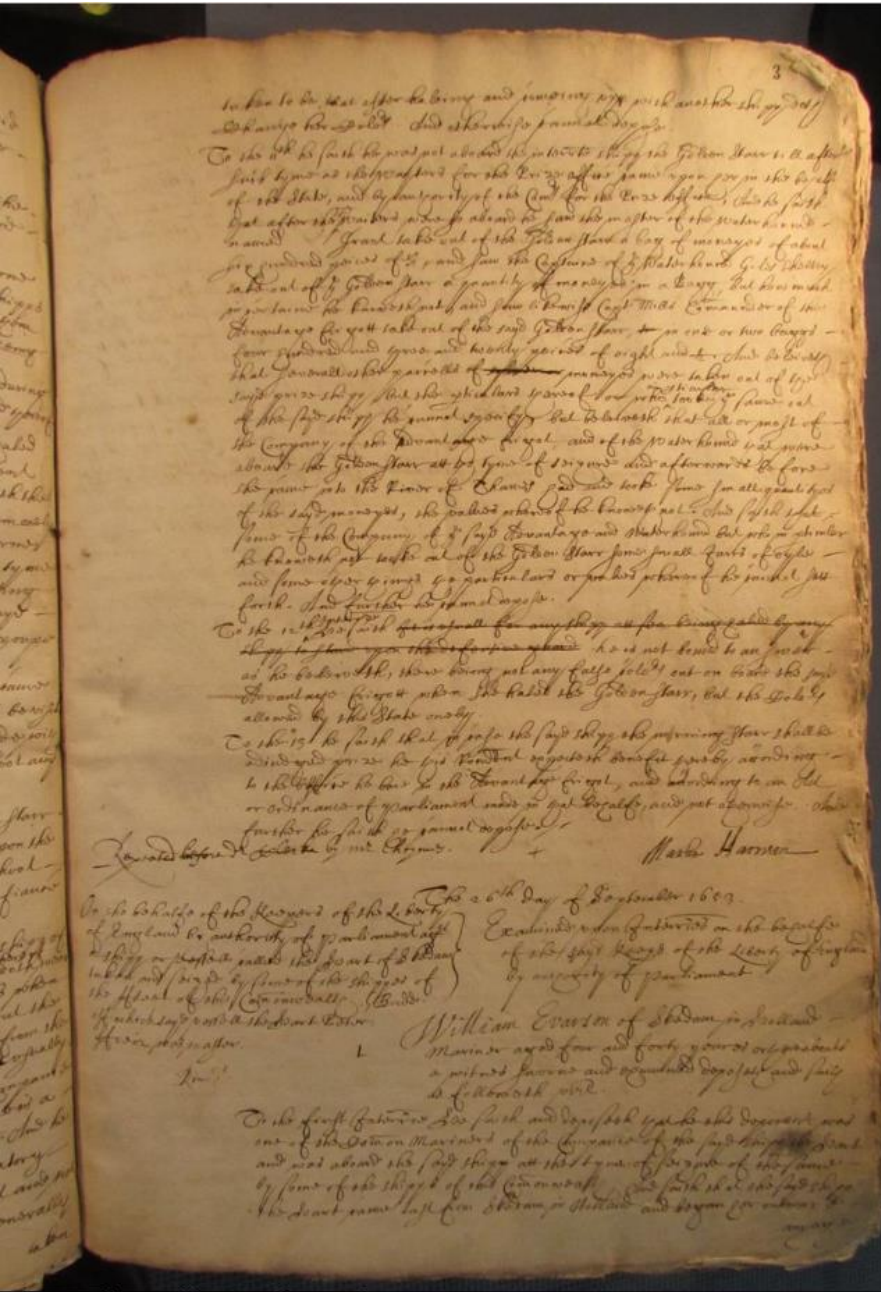
Deposition of Mark Harrison; mariner and master; resident in Wapping, Middlesex; age 27;
Dated September 21st 1659 (TNA, HCA 13/68, ff. 1r-3r)



Metadata

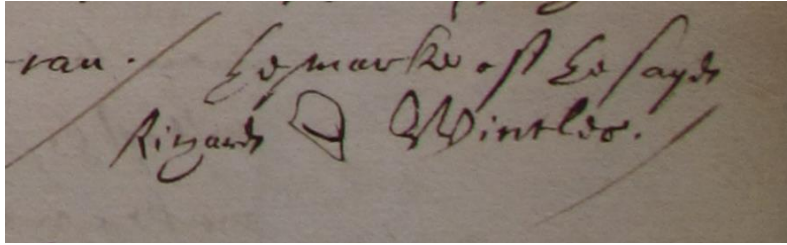


Signoff

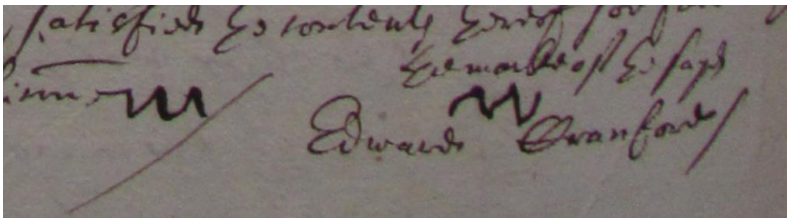


Porters handling coals, whale oil, ginger & corn

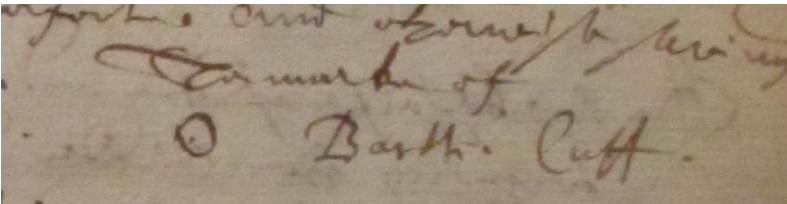
Richard Wincles, thirty-three year old porter, of the parish of Stepney, Middlesex, Dec. 15, 1656; employed as a labourer with fifteen other men to unload coals from the *Imployment* moored near Execution Dock, Wapping, into lighters for fixed rate of 12 s per man ([HCA 13/70 f.554r](#))

A handwritten signature in cursive script, reading "Richard Wincles". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

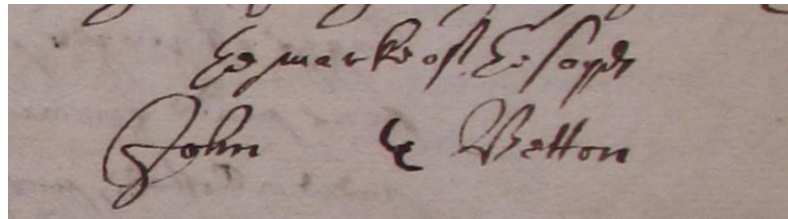
Edward Cranford, forty-four year old coale heaver or porter, of the parish of Stepney, Middlesex, Dec. 15, 1656; employed as a labourer with fifteen other men to unload coals from the *Imployment* moored near Execution Dock, Wapping, into lighters for fixed rate of 12 s per man ([HCA 13/70 f.555v](#))

A handwritten signature in cursive script, reading "Edward Cranford". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

Bartholomew Cuff, sixty year old porter of the Stillyard, of the parish of Allhallowes the Greate, London, May 15, 1658; assisted in the landing of whale oil from lighters at the Stillyard Key and loading them away into a warehouse ([HCA 13/70 f.555v](#))

A handwritten signature in cursive script, reading "Bartholomew Cuff". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

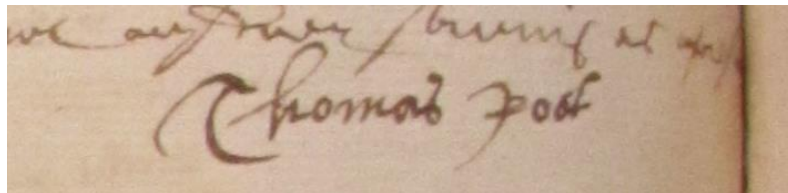
John Betton, fifty-four year old citizen and white baker of London, of the parish of Saint Buttolph Algate, London, Jul. 31, 1655; self-described as a porter employed by the Commissioners for Prize Goods to deliver ginger from a warehouse at Ralphes Key ([HCA 13/70 f.449r](#))

A handwritten signature in cursive script, reading "John Betton". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

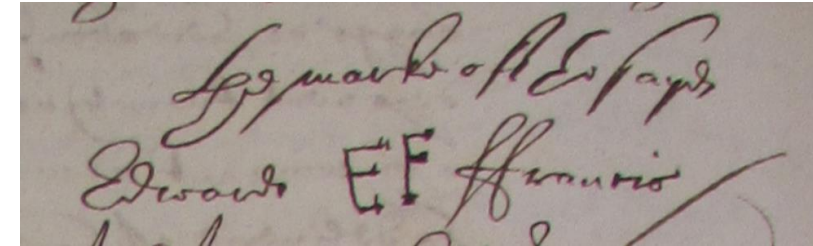
Edward Sherwin, fifty-six year old cittizen and leatherseller, of the parish of Little Allhallowes, London, Jul. 31, 1655; self-described as a porter employed by the Commissioners for Prize Goods to deliver ginger from a warehouse at Ralphes Key ([HCA 13/70 f.449v](#))

A handwritten signature in cursive script, reading "Edward Sherwin". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

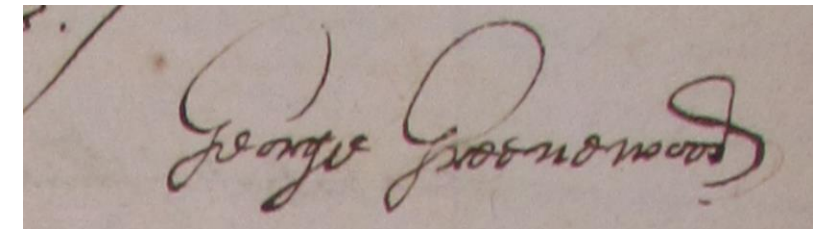
Thomas Roots, twenty-nine year old porter, of the parish of Greate Allhallowes, London, May 15, 1658; assisted in the landing of whale oil from lighters at the Stillyard Key, as one of the Stillyard porters, and loading them away into a warehouse ([HCA 13/72 f.330v](#))

A handwritten signature in cursive script, reading "Thomas Roots". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

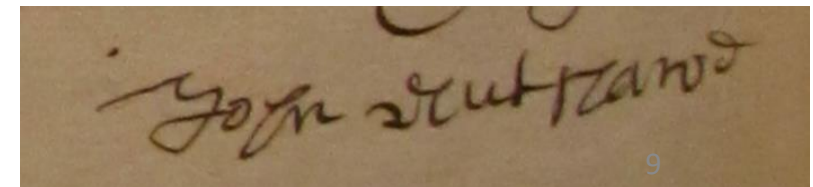
Edward ffrancis, citizen and merchantaylor of London, of the parish of Saint Olave in Southwarke, Jul. 31, 1655; self-described as a porter employed by the Commissioners for Prize Goods to deliver ginger from a warehouse at Ralphes Key ([HCA 13/70 f.450v](#))

A handwritten signature in cursive script, reading "Edward Francis". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

George Greenwood, thirty year old citizen and vintner of London, of the parish of Saint Buttolph Bishopsgate, London, Jul. 31, 1655; self-described as a porter employed by the Commissioners for Prize Goods to deliver ginger from a warehouse at Ralphes Key ([HCA 13/70 f.454r](#))

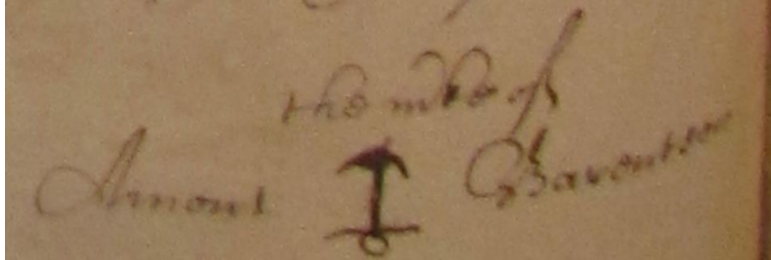
A handwritten signature in cursive script, reading "George Greenwood". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

John Nutshall, fifty-five year old corne porter, of the parish of Saint Saviours Southwarke, Nov. 19, 1653; employed with a barber chyrurgeon/corne meter, an additional corne-meter, and other labourers to unlade a cargo of what in the *ffortune* of Stettin, moored against Limehouse; eight years of experience as a corne porter ([HCA 13/70 f.352v](#))

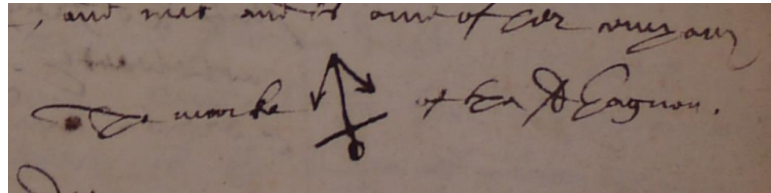
A handwritten signature in cursive script, reading "John Nutshall". Above the signature, there is some faint, partially legible text that appears to say "Ex marks of Es sayd".

Anchors

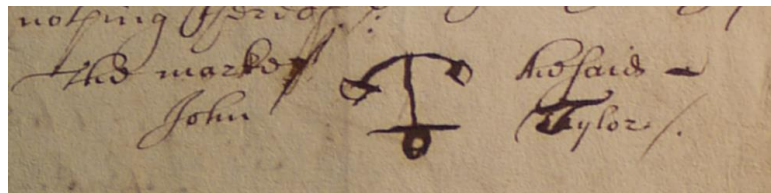
Amons Barentsen, thirty-five year old mariner, of Copenhagen, Denmark, October 13th, 1653; self-described as an “ordinary mariner”, hired to sail from the Sound to Hamburg on the *Golden Hawke* of Stockholm ([HCA 13/68 f.81v](#))



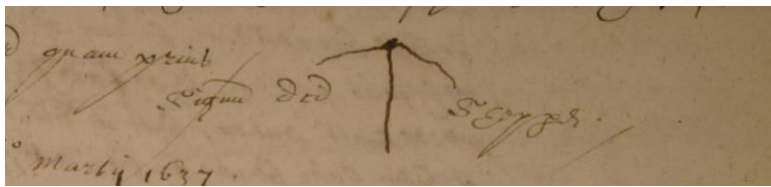
Claude de Gagnon, twenty-five year old mariner, of Melon, near Brest in Brittany, May 22nd, 1656 ([HCA 13/71 f.225r](#))



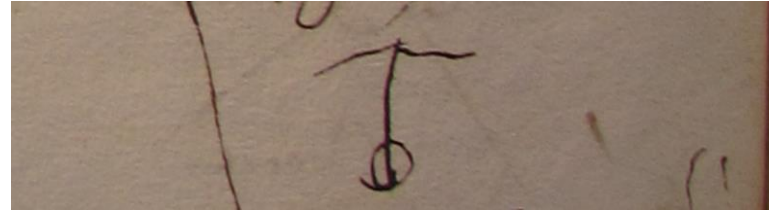
John Tylor, forty-two year old shipwright, of Lower Shadwell, in the parish of Stepney, Middlesex, February 14th, 1659 ([HCA 13/73 f.36r](#))



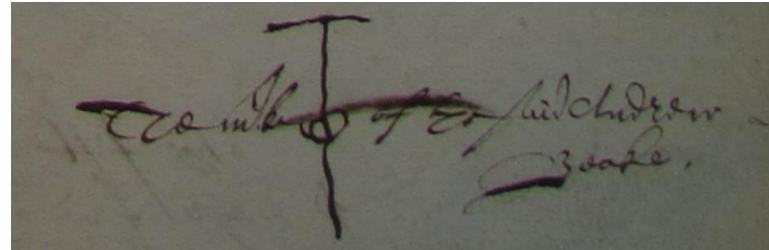
Richard Shepperd, fifty-eight year old cooke, of Brixton, Devon, March 29th, 1637; self-described cooke of the *Hope* of Ipswich ([HCA 13/53 f.87r](#))



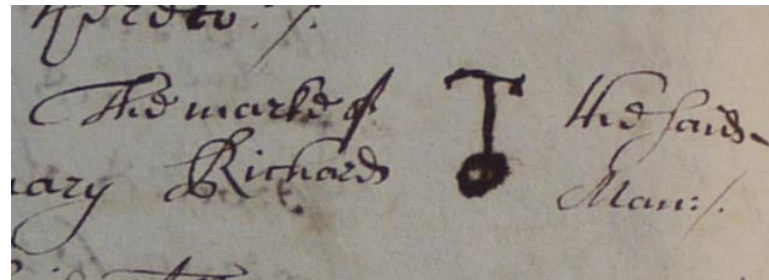
Andrew Beake, thirty-six year old lookeinglassemaker and formerly seaman, of Rose alley without Bishopsgate, London, January 21st, 1655 ([HCA 13/70 f.252v](#))



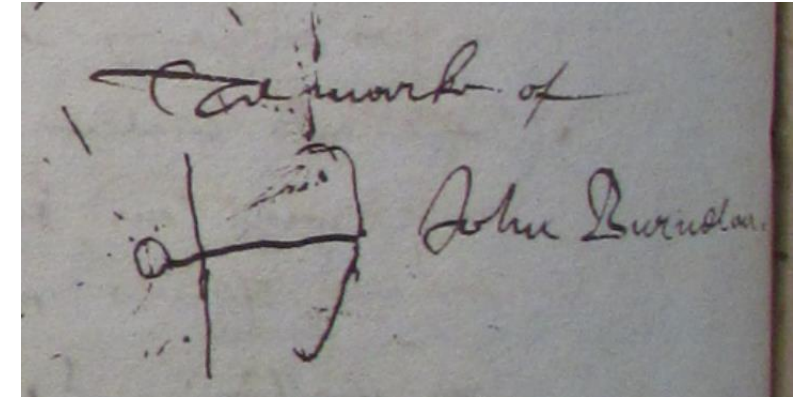
Andrew Beake, thirty-six year old looking-glasse maker, of Rose-Alley in Bishopsgate streete, London, February 13th, 1655 ([HCA 13/70 f.252v](#))



Richard Man, thirty-one year old mariner, of Southampton, January 8th, 1659; self-described common man of the *Lisbone ffrigott* on voyage to Oratava ([HCA 13/73 f.26v](#))



John Burnelau, twenty-eight year old sailor, of Mornar, France, March 30th, 1661 ([HCA 13/73 f.486v](#))

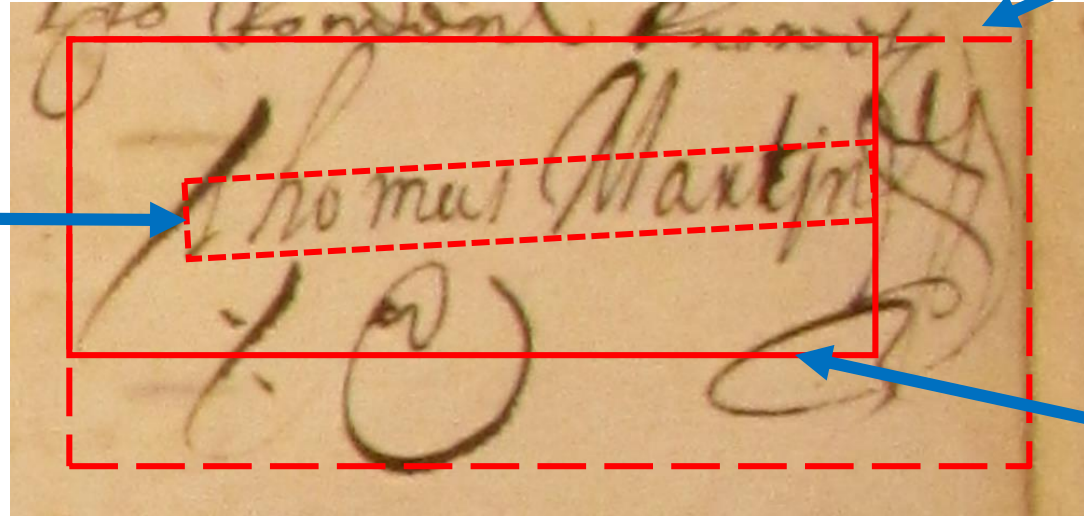


Putting boundary boxes on C17th signatures



Boundary boxes marking the visual geometry of a signature

Inside boundary box, excluding uppers and downers



Outside boundary box, including flourish

Middle boundary box, including all letters, but excluding flourish

Statistics

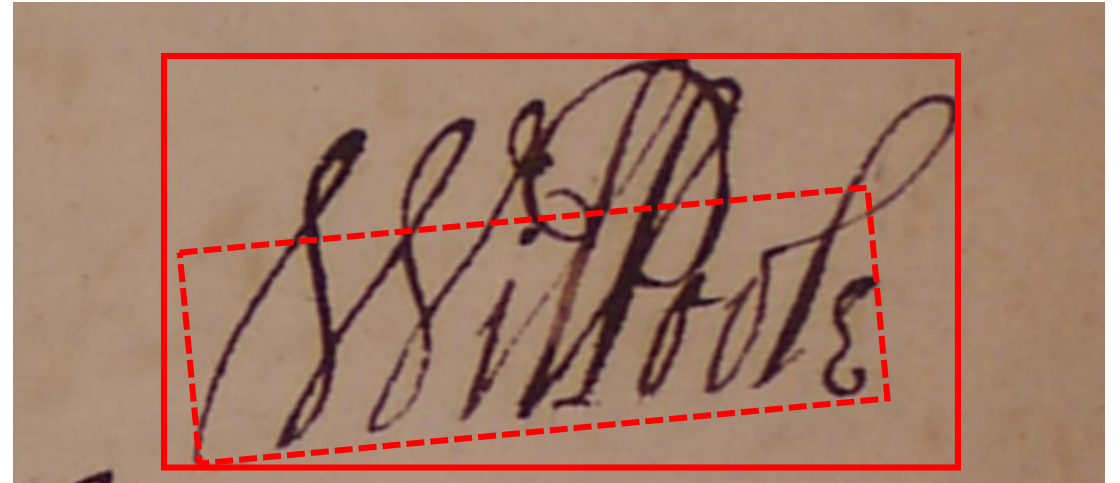
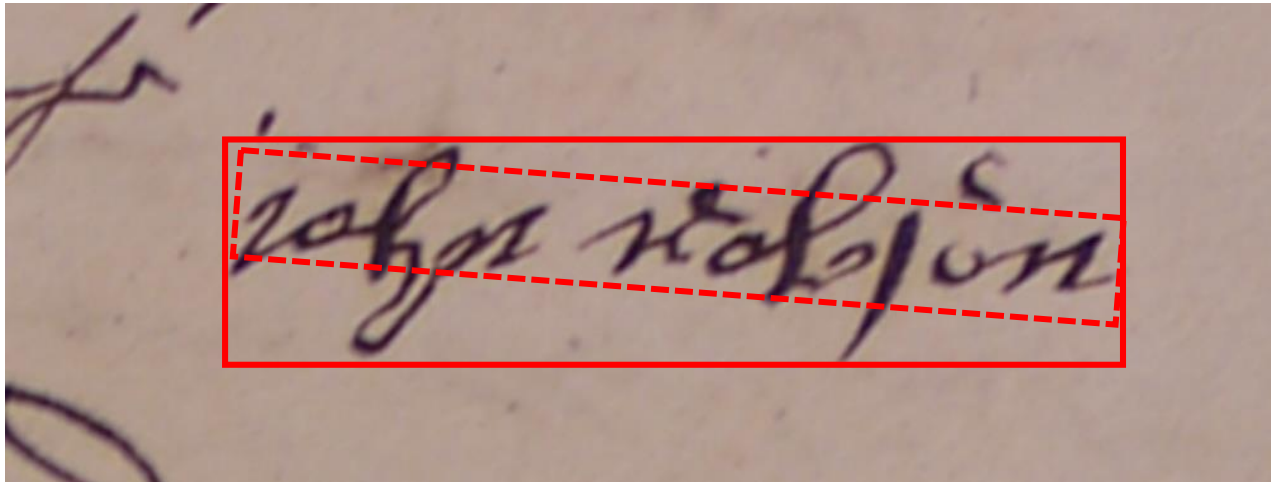
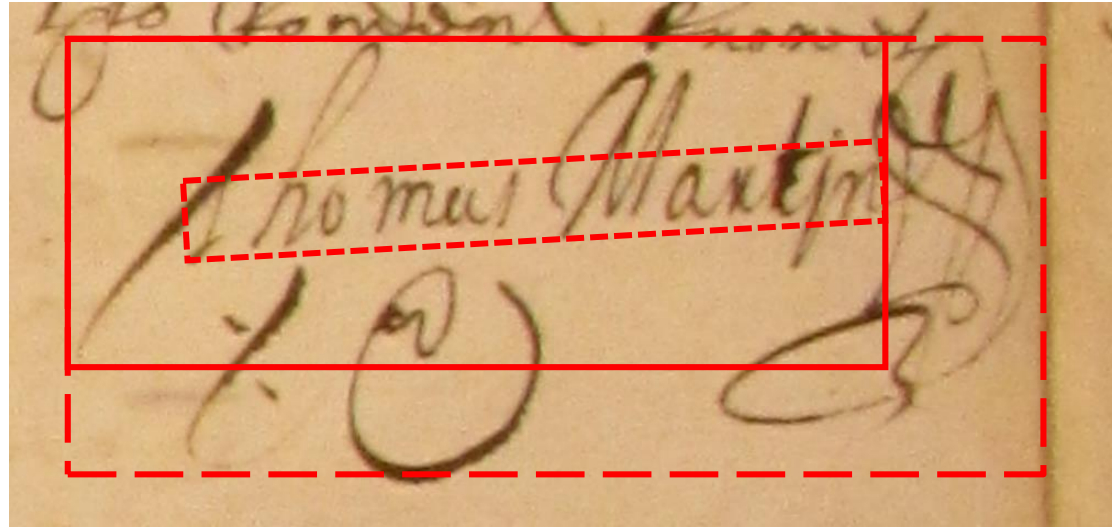
Inside boundary box: 9.0 x 1.1

Middle boundary box: 9.75 x 4.25

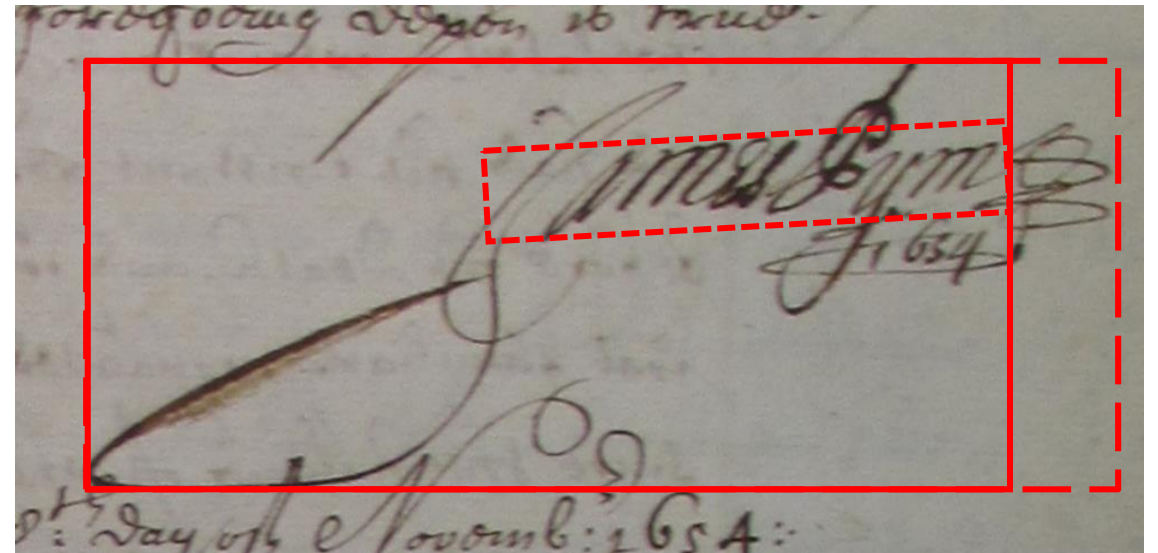
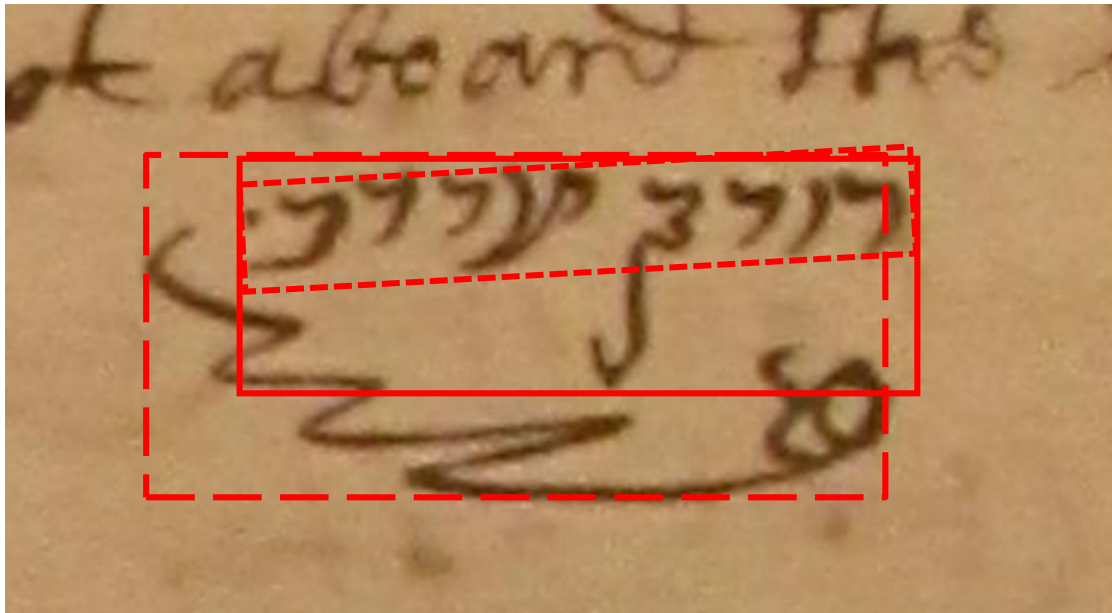
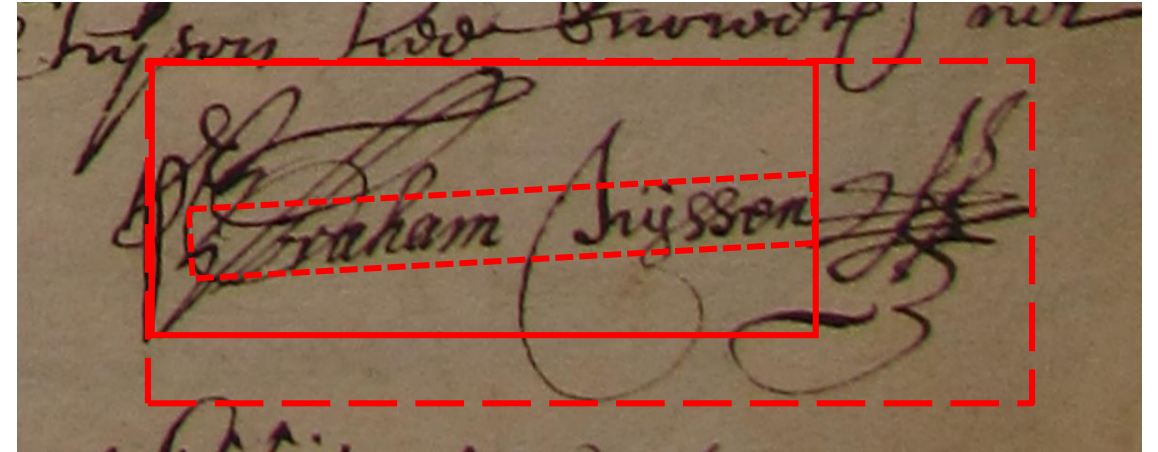
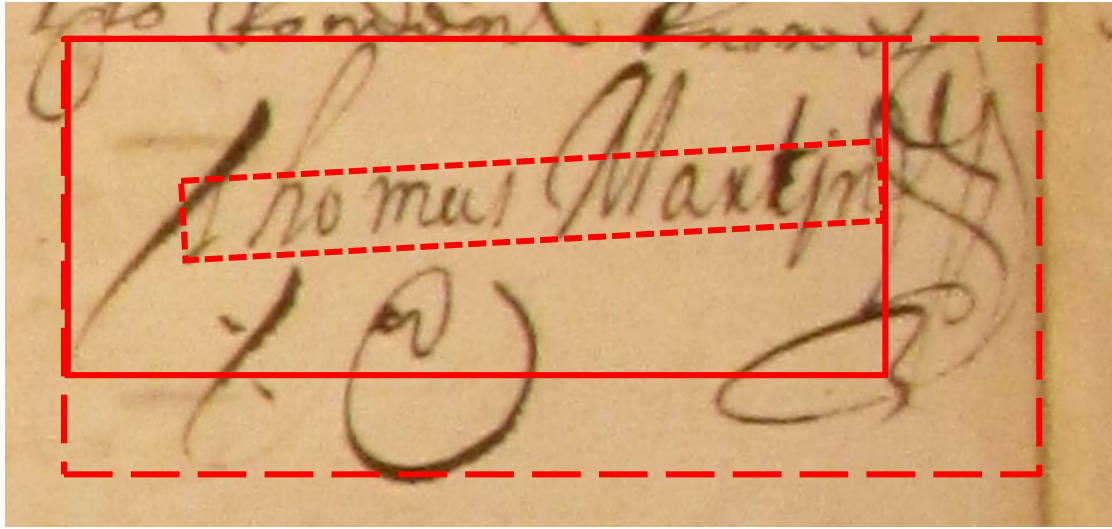
Outside boundary box: 12.75 x 5.75

Rotation from horizontal: ca. 340 degrees

Different visual geometries of signatures

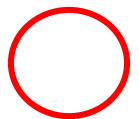
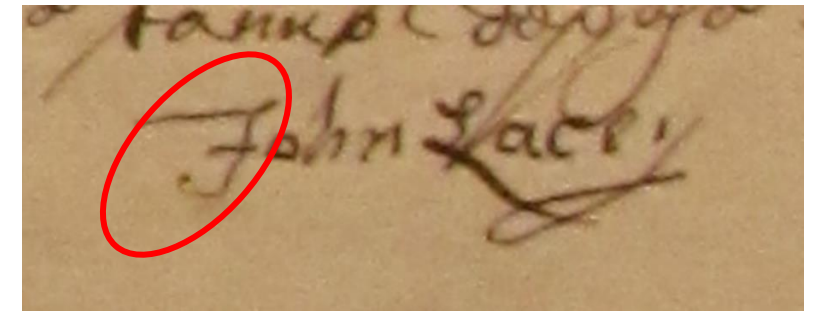
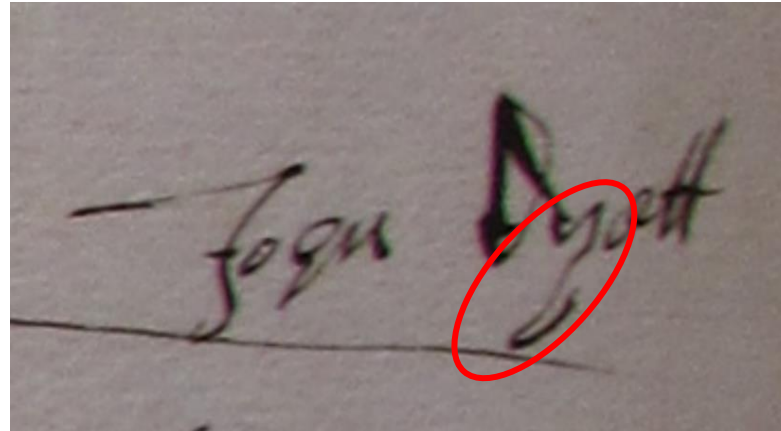
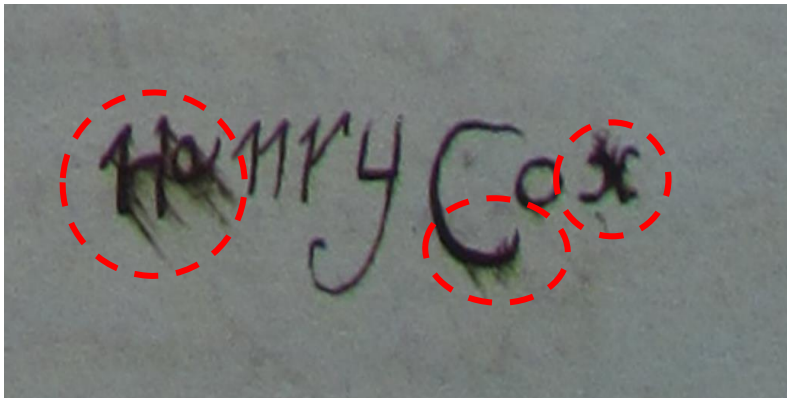
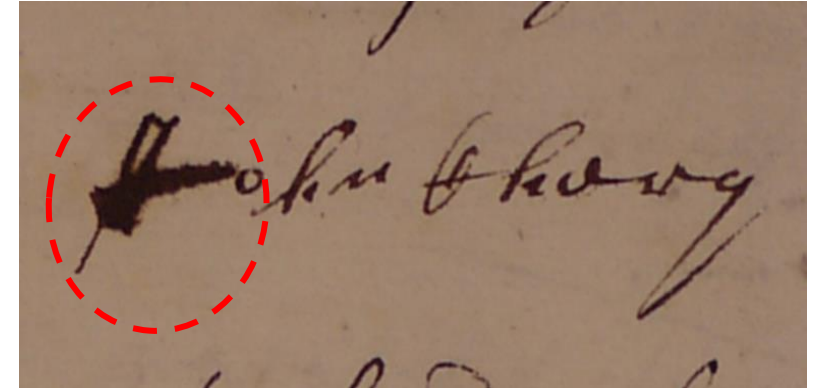
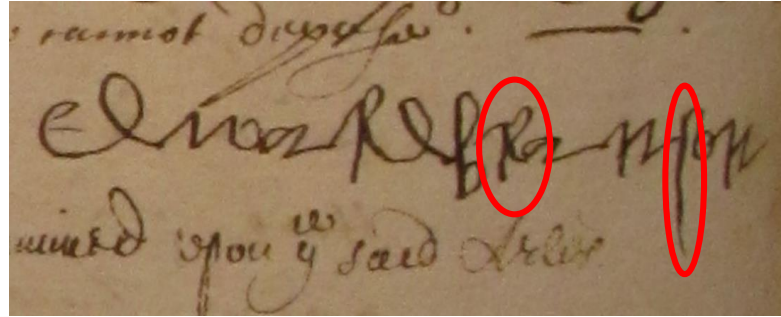
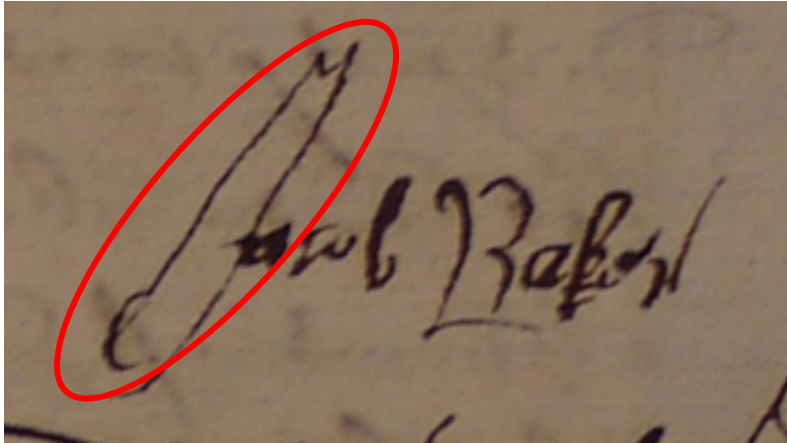


Visual geometries of flourishes – C17th Irish, Dutch, English & Moroccan merchants



Clockwise, from top LH: KaggleTestSnippet_HCA_1368_f.34v.PNG, KaggleTestSnippet_HCA_1370_f.366r.PNG, KaggleTestSnippet_HCA_1370_f.134r.PNG, KaggleTestSnippet_HCA_1368_f.58r.PNG

Physical characteristics of poorly executed signatures for machine detection



Shaky straight lines and/or loops



Ink blots or smudges

Clockwise, from top LH: KaggleTestSnippet_HCA_1371_f.263v.PNG, KaggleTestSnippet_HCA_1368_f.483v.PNG, KaggleTestSnippet_HCA_1371_f.456r.PNG, KaggleTestSnippet_HCA_1368_f.51v.PNG, KaggleTestSnippet_HCA_1370_f.168v.PNG, KaggleTestSnippet_HCA_1370_f.167r.PNG

Was it less common to use capital letters in Dutch rather than English language signatures in the C17th

Steven pieters

hijson lode snowing
Abraham Jijsson

hijde having as aforesaid
Abraham Van Sinter
dem lre 1689.

Bonwifl fannol dops
Clare & Albert
of October 1683.

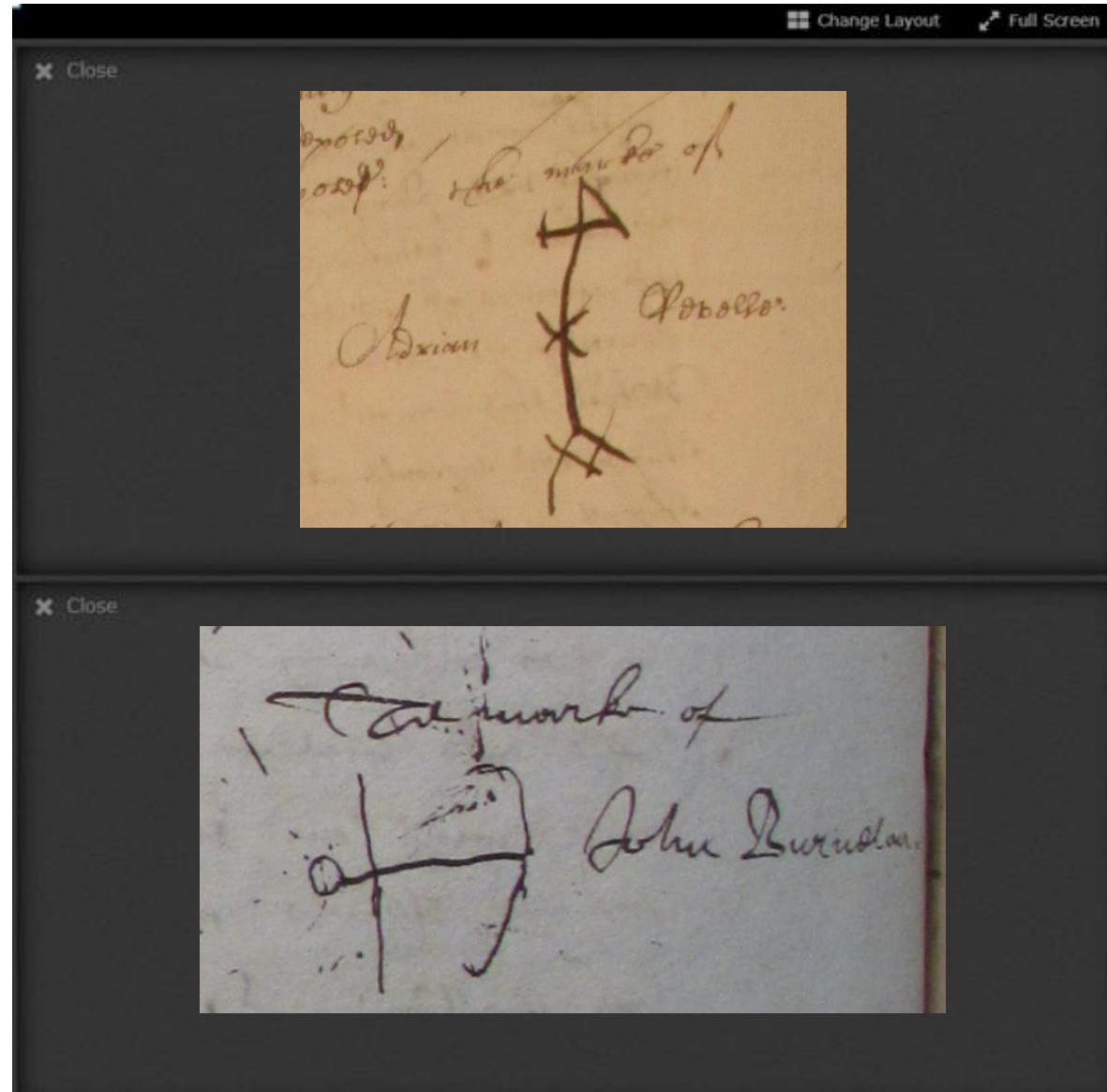
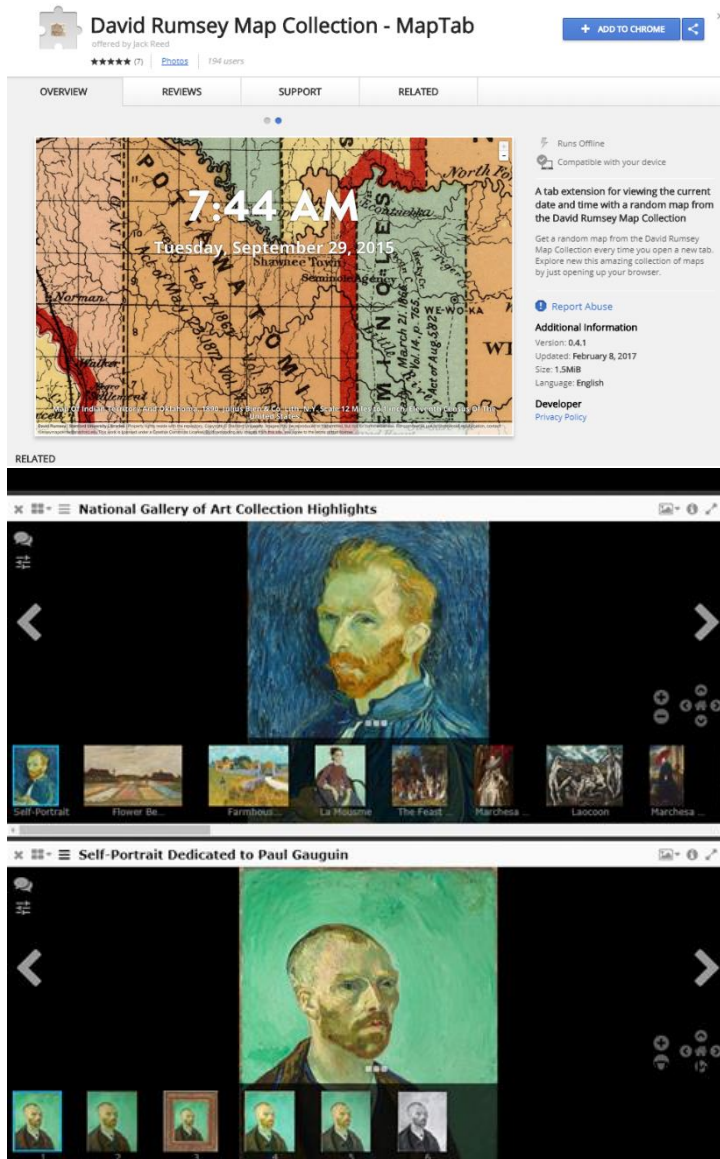
to state
living back slave

For the name another
Jan Bonbait
of October 1686.

to fannol dops
Jacob Cornelisen Jorghe

another having as aforesaid
cornelien willemsen

Conjoint analysis IIIF viewer plugin



Adrian Revelle,
twenty-three year
old mariner, of
Dunquirke in
fflanders, November
12th, 1653; “hee
onely speaketh the
flemmish speech”
([HCA 13/68 f.183v](#))

John Burnelau,
twenty-eight year
old sailor, of Mornar,
France, March 30th,
1661 ([HCA 13/73
f.486v](#))

Reading

Colin Greenstreet, Pattern recognition of signatures and marks in historical manuscripts as the basis for sub-population recognition, March 2018 [available Signsofliteracy Github repository: [Signsoliteracy/Signoff](#)]

Colin Greenstreet, C17th alphabet of initials, 4th edn., April 4th, 2018 [available Signsofliteracy Github repository: [Signsoliteracy/Signoff](#)]

[Mark Hailwood, 'The Rabble that Cannot Read', Ordinary Peoples Literacy in Seventeenth-Century England, October 13th, 2014](#)

[David Cressy, Literacy and the Social Order: Reading & Writing in Tudor and Stuart England, 1980](#)

Reading

[IAM Handwriting Database 3.0](#)

- The IAM Handwriting Database contains forms of handwritten English text which can be used to train and test handwritten text recognizers and to perform writer identification and verification experiments.
- The database was first published in [\[1\]](#) at the ICDAR 1999.
- The database contains forms of unconstrained handwritten text, which were scanned at a resolution of 300dpi and saved as PNG images with 256 gray levels. The figure below provides samples of a complete form, a text line and some extracted words.
- FKI: Research Group on Computer Vision and Artificial Intelligence [INF](#), [University of Bern](#)

U. Marti and H. Bunke. A full English sentence database for off-line handwriting recognition. In Proc. of the 5th Int. Conf. on Document Analysis and Recognition, pages 705 - 708, 1999

U. Marti and H. Bunke. The IAM-database: An English Sentence Database for Off-line Handwriting Recognition. Int. Journal on Document Analysis and Recognition, Volume 5, pages 39 - 46, 2002.

[NIST Handprinted Forms and Characters Database \[NIST special database 19\]](#)

- Final accumulation of NIST's handprinted sample data
- Full page HSF forms from 3600 writers
- Separate digit, upper and lower case, and free text fields
- Over 800,000 images with hand checked classifications

Siamese Convolutional Neural Networks for Authorship Verification

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Abstract

Determining handwriting authorship of a written text has practical significance in the realm of forensics, signature verification, and literary history. While there have been studies in signature verification and handwriting classification, a vast literature review reveals that very little work has been done in handwriting verification. Recent advances in convolutional architectures, particularly those involving facial verification, suggest that the task can be tackled effectively. In this study, we build a Siamese convolutional neural network to determine whether two pieces of handwriting are written by the same author. We examine questions such as whether long pieces of handwriting must be present to achieve good results, how many samples are needed, what features are important, and how different architectures perform on this task. We explore different convolutional architectures like VGG, GoogLeNet and ResNet, to determine which architecture produces the best encoding of each sample. We note that our best performing single model, TinyResNet, achieves a 92.08% accuracy on the held out test set.

1. Introduction

Determining the authorship of a written text has practical significance in the realm of forensics, signature verification, and literary history [3]. In manuscript analysis, for instance, historians frequently ask questions regarding the number of authors for a text, whether an anonymous work can be confidently attributed to a historical figure, and what time period a text might be from. These kinds of analyses are all based upon comparisons between different writing samples [1]. Techniques in the field have remained largely subjective, however, making the transition to automatic tools difficult.

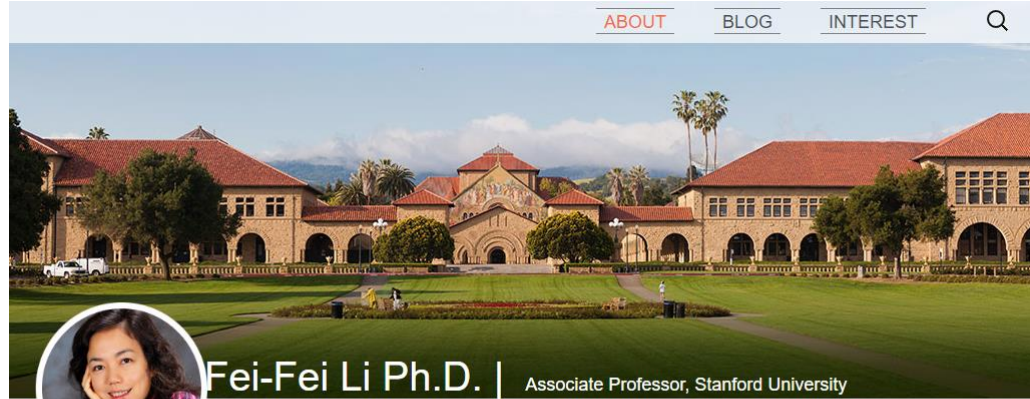
In addition, handwriting analysis is an established area of study in forensics, but there has not yet been any formal experiments measuring the accuracy of such analysis. As a result, the field is surrounded by much skepticism because of how subjective the process is (compared to, say, DNA testing) [5]. In addition, forensic handwriting analysis is time-intensive and requires two years of training for a person to obtain proper qualifications. The primary objective of this project is to develop an automatic, high-accuracy system which can determine if any two writing samples are written by the same person. In addition, our system should be able to handle authors it has never encountered before.

2. Background and Related Work

Our objective fits well with the Siamese CNN neural network architecture, which was first developed in 1993 to tackle the signature verification problem. [3] This type of architecture takes in two inputs and outputs a distance metric for the inputs. Bromley et al. was able to detect 95% of genuine signatures using this architecture. However, note that the signature verification problem expects a pair of inputs to be very similar to each other to be considered a match. This setup would not be effective for the problem we are trying to tackle, because our system should be agnostic to the actual text in a writing sample.

Other researchers have focused more closely on the authorship identification problem. A study in 2015 by Xing et al. reported an accuracy of 97% in classifying English writing samples for 657 authors. [11] They used the same dataset we will be using in this paper, the IAM Handwriting Database, and a 4-layer CNN. This study gave us confidence that we can achieve high accuracies on authorship problems using the IAM dataset. In a very recent research study from 2016, Yang et al. was able to achieve a 95% accuracy in classifying the authors for Chinese text samples,

Stanford University Department of Engineering



I am an Associate Professor at *the Computer Science Department* at *Stanford University*. I received my Ph.D. *degree from California Institute of Technology*, and a B.S. in Physics from *Princeton University*.

I am currently the Director of the *Stanford Artificial Intelligence Lab* and the *Stanford Vision Lab*, where I work with the most brilliant students and colleagues worldwide to build smart algorithms that enable computers and robots to see and think, as well as to conduct cognitive and neuroimaging experiments to discover how brains see and think.



I am a Ph.D. student in the *Stanford Vision Lab*, advised by *Prof. Fei-Fei Li*. My research interests are in computer vision, machine learning, and deep learning. I'm particularly interested in the areas of video understanding, human action recognition, and healthcare applications.

I interned at Facebook AI Research in Summer 2016, and Google Cloud AI in Summer 2017. I also co-taught Stanford's CS231N Convolutional Neural Networks course in 2017, with Justin Johnson and Fei-Fei Li.

Before starting my Ph.D., I received a B.S. in Electrical Engineering in 2010, and an M.S. in Electrical Engineering in 2013, both from Stanford. I also worked as a software engineer at Rockmelt (acquired by Yahoo) from 2009-2011.