LIBRARY HSILING

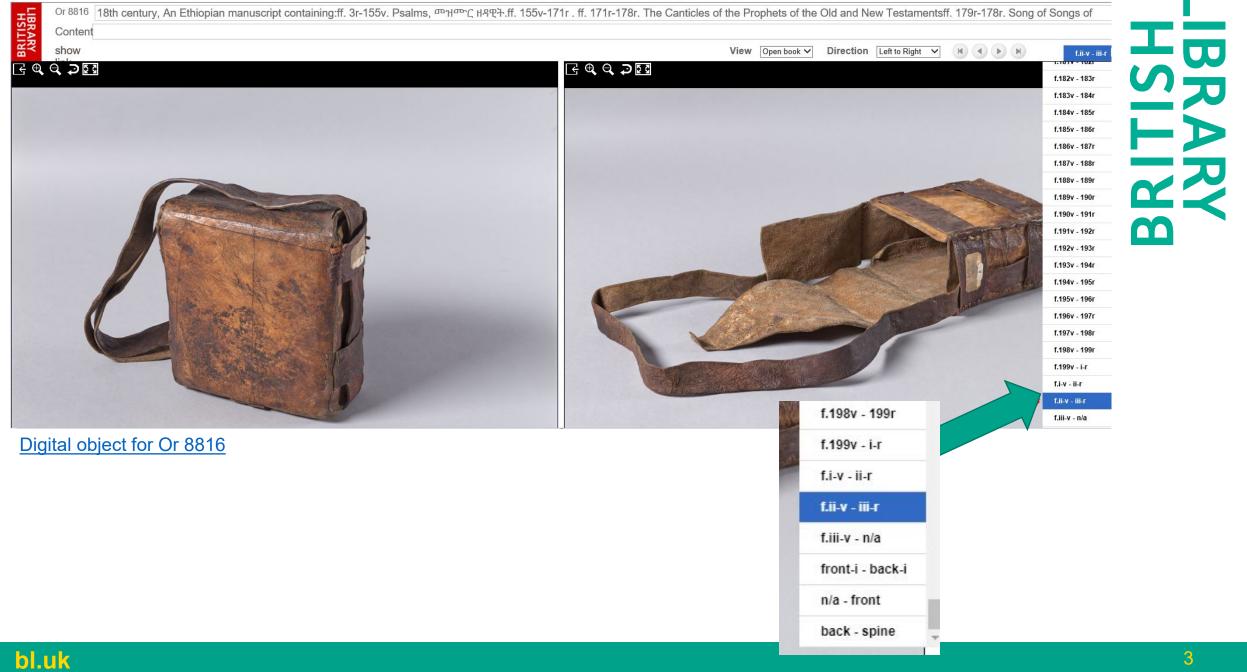
flyswot: garden-variety machine learning applications

Catherine Cronin – Digitisation Workflow Officer Daniel van Strien – Digital Curator Andrew Longworth – Digitisation Workflow Manager





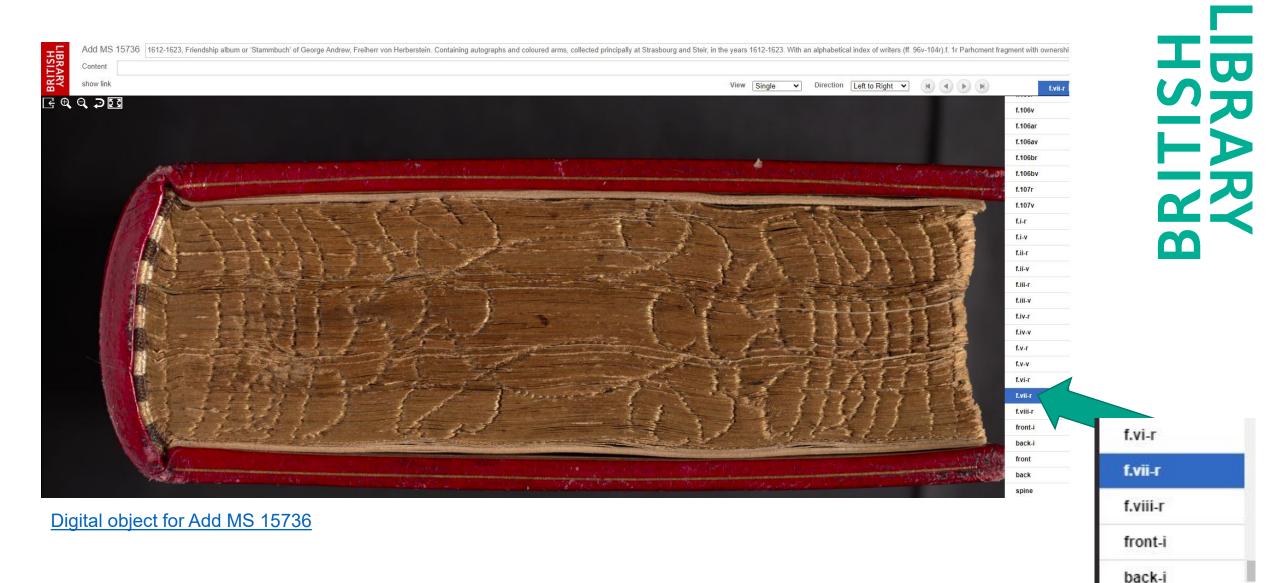
What do all these images have in common?



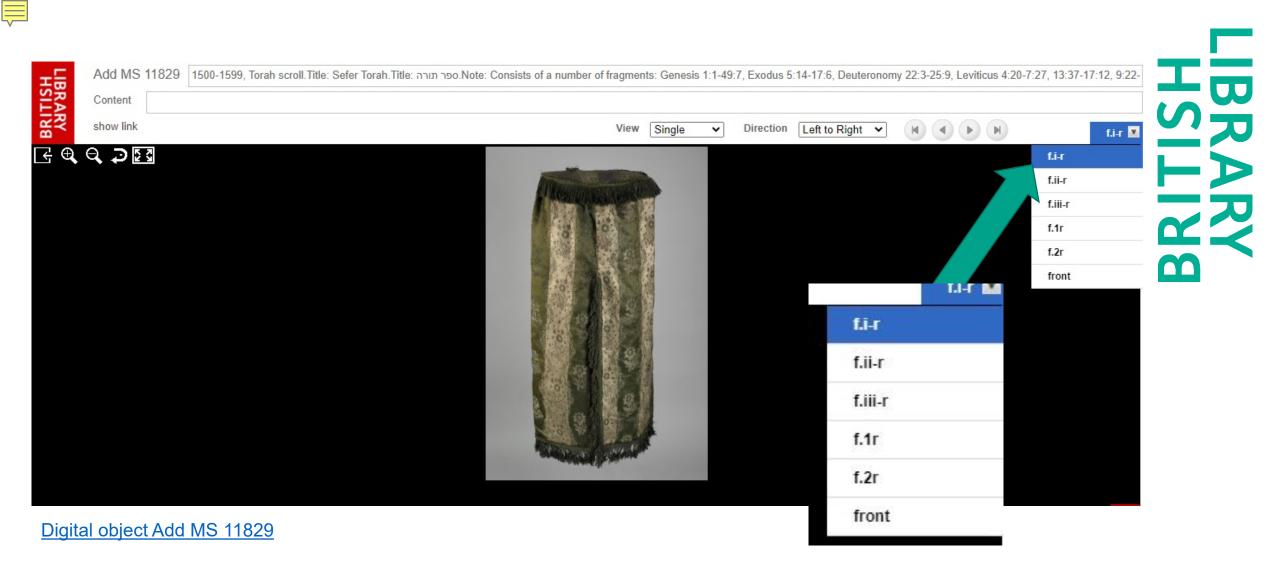
Or 12467 1660, Psalter, ዳዊት.ff. 1r-2v. Prayer for the dying. ff. 3r-7v. A fragment of the Miracles of the Virgin Mary containing five miracles, the end of the last missing.ff. 8r-129r. Psalms, Incipit: ፍካሬ ዘዳድቃን ወዘጋጥአን መዝሙር ዘዳዊት ፩ ብፁዕ ብንሲ ዘሌሖረ.ff. 129v-142v. The Canticles of the Prophets of the Old and IBRARY HSILIN Content show link View Open book ¥ H () H Direction Left to Right V f.i-v - ii-r E € Q ⊋ Σ3 E € € € ⊋ 🖸 f.151v - 152r This Bost in the Unrhave Language f.152v - 153r $- \mathbf{D}$ was brought from Magdada by f.153v - 154r f.154v - 155r Capto Withiam Wils an Edwards of the Madras Cavalay, - who held am f.155v - 156r f.156v - 157r f.157v - 158r apprint ment linde Lord Napier f.158v - 159r f.159v - 160r in that wonderful Exhed it in ins f.160v - 161r f.161v - 162r the hear of aly ssymi - when the f.162v - 163r Curch and brastful Thing Theorder f.163v - 164r f.164v - 165r Show himself in a fit of tespain at the hopelas State of the spain It was forwarded by a ficiency Edward's to the Ber Row Scheme f.165v - 166r f.166y - 167r f.167v - 168r f.168y - 169i f.169v - i-r f.i-v - ii-r f.ii-v - iii-r f.iii-v - n/a Digital object for Or 12647 f.168v - 169r f.169v - i-r f.i-v - ii-r f.il-v - ili-r f.iii-v - n/a front-i - back-i bl.uk

show link	View Open boo	k ✔ Directi	on Left to Right 🖌	H 4 P H	Liv-v - v-r	L L
			te es letre het, Som hound de confecte Trip at gan Iran Mill dan deleis & de vite Guild lan ethelle invert anteres de lan en I. Guthlart Mil Guthlart gahet Bannele langtad alten del la vote Ballene de Guht Bannele langtad alten del de vote Ballene de Guht Bannele langtad alten de la vote Statene and A soit and he ballene des A soit and he ballene des A soit and he ballene de Guht of the Alter alten de la soit Alter de Alten de la soit Alter de Alten de la soit Alter alten de annet Mange de Alter al de soit Alter for ben de annet Mange de for ben de annet de Alter for ben de tan de la Manne d'Annet Alter alter de the State and for ben de annet de Annet for ben de tan hege annes alte antigen late Names	annik. 12. Jehom velgens Jehom vel	f.i-v - ii-r f.ii-v - ii-r f.iii-v - iv-r f.v-v - vi-r f.v-v - vi-r f.vi-v - 1r f.1v - 2r f.2v - 3r f.2v - 3r f.3v - 4r f.4v - 5r f.5v - 6r f.6v - 7r f.7v - 8r f.8v - 9r f.9v - 10r	f.i-v - ii-r f.ii-v - iii-r f.iii-v - iii-r
al object for Add MS 38132						f.iv-v - v-r
						f.v-v - vi-r
						f.vi-v - 1r

Content		
show link	View Single View Direction Left to Right View	f.ii-r 🖬 🚺
		452V
		453r
		453v 454r
		454v
		454r 454v 455r 455v
		455v
	1.4	456r
	T.4	456v
		ii-r
		ront-i
		ack-i
	1.450v	ont
		ack
		pine 🗸
tal object for Add MS 48002	front-i	
	back-i	
	front	
	back	
	spine	









DIGITISED MANUSCRIPTS

They are all FAKE FLYSHEETS

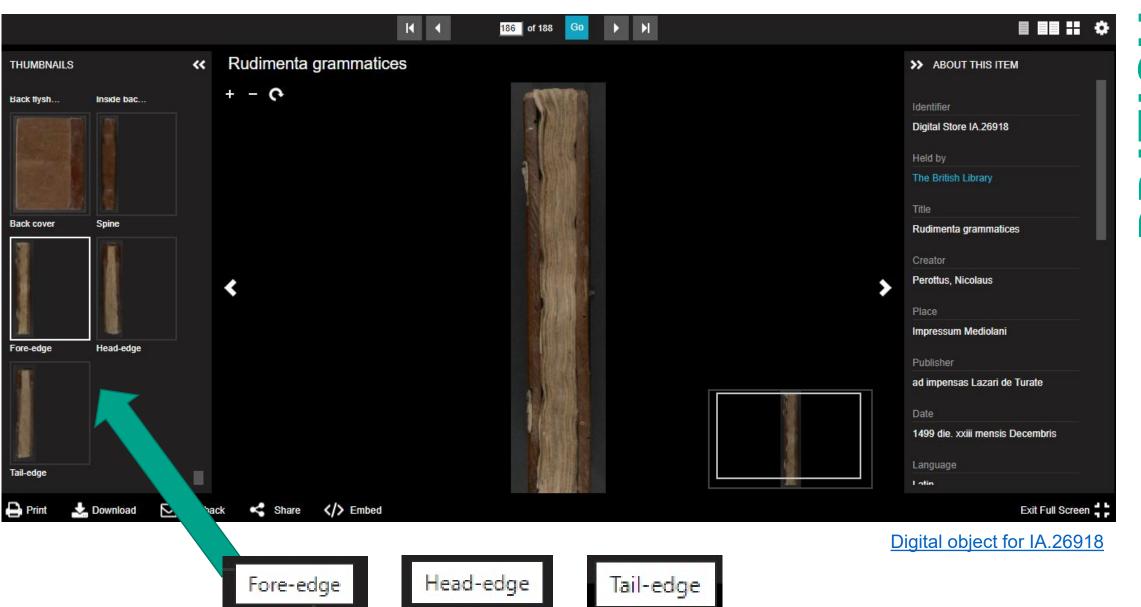
- Limited set of visible image labels
- Inflexible order sequence of images
- Tied to an old digital object platform
- Labels derived from image file names
- Many images incorrectly labelled as a flysheet



New IIIF Universal Viewer

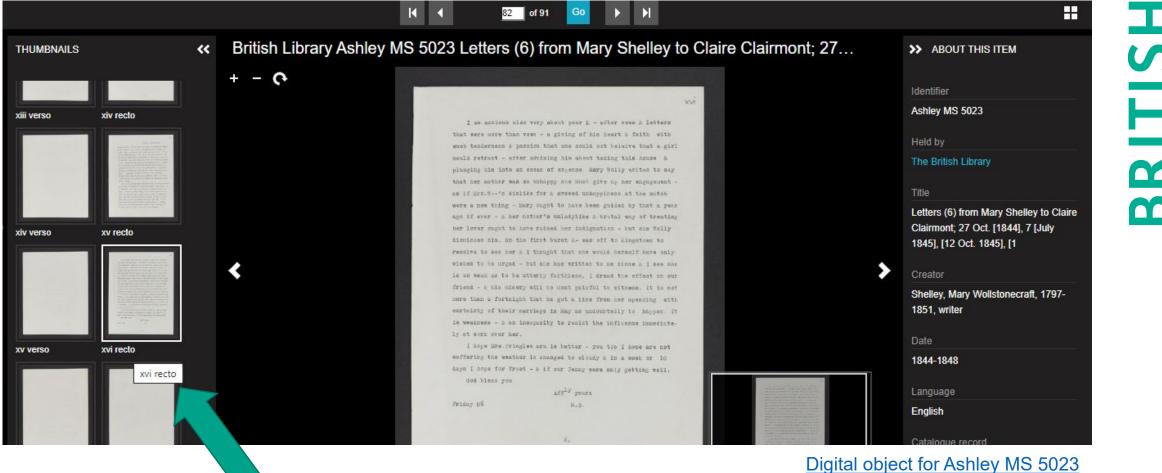
- Digital objects migrated to new viewer
- Standardised vocabulary for image labels
- Flexibility in order sequence of images
- Ability to apply appropriate labels to 'fake flysheet' images





LIBRARY HSILING

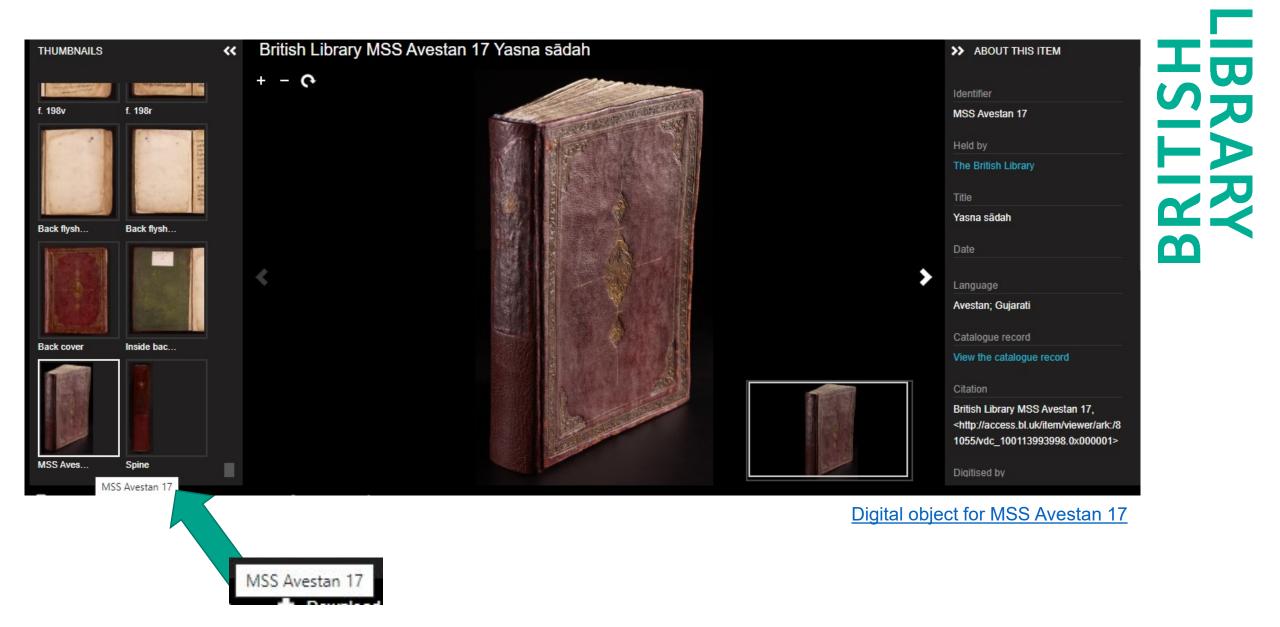
Ē



xvi recto



Inside back case unfolded 2



bl.uk



We have a mountain of digitised content:

- Tens of thousands of images
- About 1 petabyte (1,000 terabytes)

How do we identify which images are 'fake flysheets'?



Using computer vision to detect fake flysheets

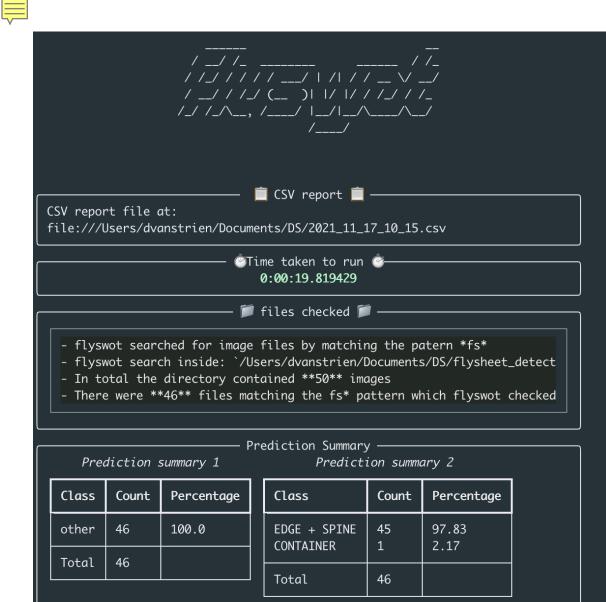
- Created training data by putting images into folders (integrating into existing workflows)
- Trained 'boring' CV models (ResNets)
- DVC and other tools used to make pipeline (semi) reproducible when new training data is available





flyswot

- Command Line Application used to 'deploy' our models
- Searches for images with a flysheet filename
- Predicts whether they are an actual flysheet or 'other' via a CSV report

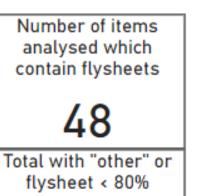


Ę

Incorporating flyswot into the workflow

- Silver bullet!
- Unfortunately we have a large and varied collection
- flysheet vs other
- Interpret results using Power BI
- Allows us to assess the state of the image set and the amount of resource required

TIFF predictio	n 1	
1 flysheet vs othe	er Total	
flysheet	434	
other	58	
Total	492	
TIFF predictio 2 label category		
flysheet	446	
page + folio	28	
cover	10	
other	4	
container	2	
edge + spine	2	
Total	492	



37



Interpreting the results

• Allows us to focus on the items with fake flysheets

Items and files = "other" and/or flysheet with less than 80% confidence				
directory	1 flysheet vs other	confidence	2 label category	confidence
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_10302\Tiff				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_10302\Tiff\add_ms_10302_fs001r.tif	other	91.08%	page + folio	71.10%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_11414\tiffs				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_11414\tiffs\add_ms_11414_fs001r.tif	flysheet	68.07%	flysheet	90.01%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_11414\tiffs\add_ms_11414_fse001r.tif	flysheet	50.88%	flysheet	83.79%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_15705\tiffs				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_15705\tiffs\add_ms_15705_fse007r.tif	other	95.38%	page + folio	94.66%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18144\Tiffs 300 ppi				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18144\Tiffs 300 ppi\add_ms_18144_fs001r.tif	flysheet	76.97%	flysheet	85.57%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18144\Tiffs 300 ppi\add_ms_18144_fs001v.tif	other	93.15%	other	48.20%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18144\Tiffs 300 ppi\add_ms_18144_fse005r.tif	other	99.93%	edge + spine	95.56%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18719\Tiffs 300 ppi				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18719\Tiffs 300 ppi\add_ms_18719_fs001r.tif	other	98.79%	cover	97.64%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18719\Tiffs 300 ppi\add_ms_18719_fse003r.tif	other	90.11%	page + folio	79.97%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_18719\Tiffs 300 ppi\add_ms_18719_fse012v.tif	other	99.53%	cover	92.90%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_19553\Tiff				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_19553\Tiff\add_ms_19553_fs001v.tif	other	99.85%	page + folio	99.02%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_21247\Tiff				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_21247\Tiff\add_ms_21247_fs004v.tif	other	75.18%	page + folio	62.36%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_25435\tiffs				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_25435\tiffs\add_ms_25435_fse002v.tif	flysheet	71.88%	flysheet	92.67%
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_27695\tiffs				
\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_27695\tiffs\add_ms_27695_fs002r.tif	other	97.07%	page + folio	96.34%

Ē

Continuous improvement

• Highlights any unexpected predictions

\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_27695\tiffs\add_ms_27695_fse007v.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_65194\Tiff\add_ms_65194_fse001v.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_65194\Tiff\add_ms_65194_fse002r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\add_ms_89309\300ppi tiffs\add_ms_89309_fs001r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\cotton_ms_tiberius_a_vii!1\tiffs\cotton_ms_tiberius_a_vii!1_fs001r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\egerton_ms_2709\tiffs\egerton_ms_2709_fs003r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\egerton_ms_3018\tiffs\egerton_ms_3018_fs001r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\egerton_ms_3018\tiffs\egerton_ms_3018_fs001r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\egerton_ms_3018\tiffs\egerton_ms_3018_fs001r.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\egerton_ms_3018\tiffs\royal_ms_17_a_xliv_fs001v.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\royal_ms_17_a_xliv\tiffs\royal_ms_17_a_xliv_fs001v.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\royal_ms_17_a_xliv\tiffs\royal_ms_17_a_xliv_fs002v.tif \\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manusc

\\ad\collections\Preservation Digitisation Bids 2014-15\Finished Manuscripts 2\royal_ms_17_a_xliv\tiffs\royal_ms_17_a_xliv_fse004v.tif

 Refine the thresholds, give it examples to learn from and improve accuracy

	_		
confidence		1 flysheet v	s other
49.16%			
88.31%	h	2 label categ	IOFV.
57.86%		Select all	
61.65%		flysheet	
76.67%			
59.65%			
54.23%			
50.62%			
77.77%	L		
81.42%		1 flysheet v	s other
81.51%		50.04%	99,99%
82.32%		50.0470	33,3370
		—	
	Ī	2 label cate	gory con
		45.32%	99.98%
		—	
	┢	-	
		Comparing	
		 Mismatc 	h

Same

confidence 2 label

74.94%

51.479

category

flysheet

1 flysheet

vs other

_	
S	7
	\geq
2	ア

Flexible and understanding

- One of many tools we use as part of an adaptable workflow
- Manual intervention is still required but this is desirable
- Building trust and confidence in machine learning

For printed text or notices of this MS. see:-D.W. Singer, Cat. of Alchemical MSS., 1928, no. 814. Ent. Holmyourd The Ordinall of Akhimy written in Thomas Norton of Brill-of urs, ed. E.J. Hormyand, 19735c. Theatrum Chemicum Britannium, 1652 ed. E. Ashmole. Geneva 1716 Bubliotheca Chemica Cunora , 1702, ed if Mangel. New edition for E.E.T.S. My. John Reidy 0.S. 272 Readers are requested to notify the Superintendent of the Students' Room of any additions that may be made to the above. add_ms_10302_fs001r.tif 3 Flysheet f. [i-r]



Thank you

Catherine.Cronin@bl.uk Daniel.Van-Strien@bl.uk Andrew.Longworth@bl.uk

LIBRARY