Drunk and Disorderly Data: Applying a natural language processing algorithm to classify alcohol-related crimes in police data

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### **Background** | alcohol-related crime in the UK

42% of violent crimes are alcohol-related

Economic impact: £11 billion p/year

Social impact: involving injury, inequalities in victimisation

Office for National Statistics (2021)

Home Office (2012)

Bryant (2020), Green et al (2017), Lightowlers et al (2021)

### Background | UK Data on alcohol-related crime

### Secure data – police data

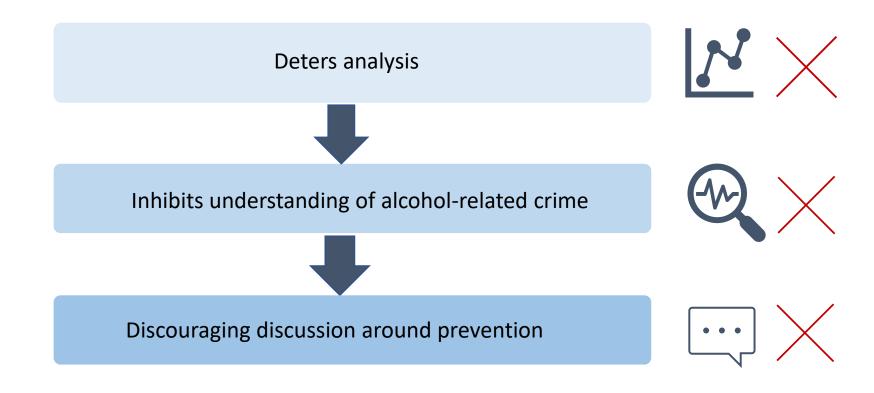
- Alcohol indicator
- Spatial
- Detailed crime descriptions

### Background | Data on alcohol-related crime

Secure data – police data

- Alcohol indicator
- Spatial
- Detailed crime descriptions

## Background | The consequences...



### Data

Merseyside Police April 2021 – September 2022 All crime types captured

#### Fields of interest

- Crime description/MO Field
- Alcohol indicator
- Time variables (month, day of week, time of day)
- Crime type



### Data

Merseyside Police April 2021 – September 2022 All crime types captured

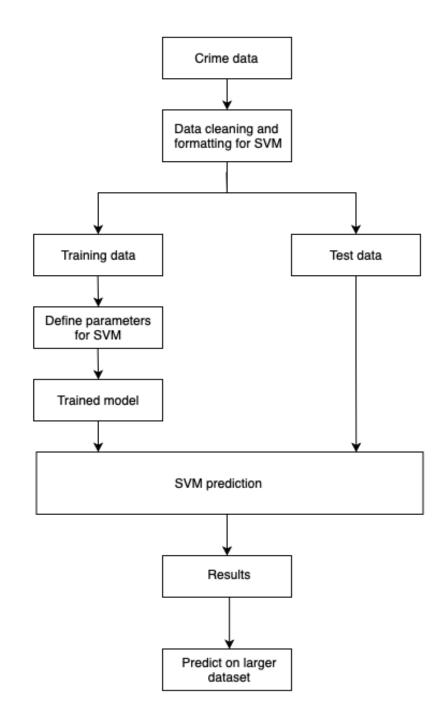
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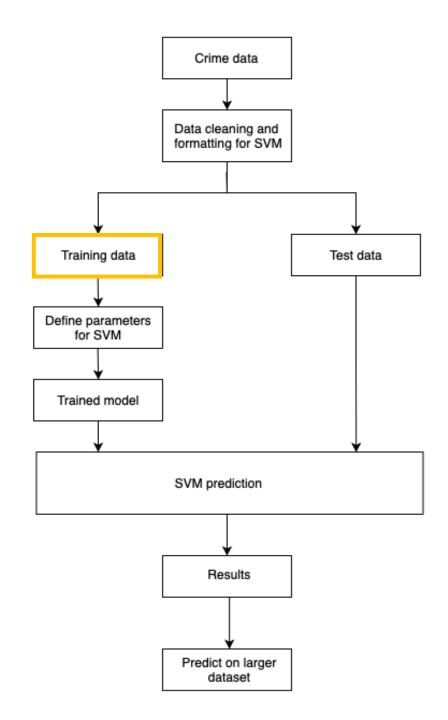
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### Aim | A new measure – text classification

- Apply Natural Language Processing (NLP) Algorithm to crime descriptions and classify as alcohol-related
  - Decipher context
  - Applications in other areas of research





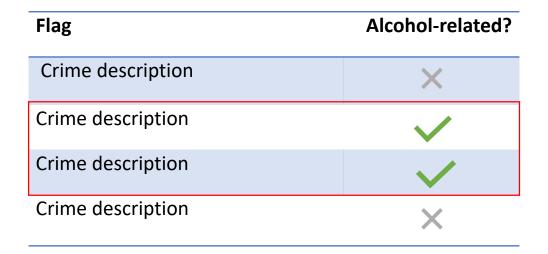
Training (80% data)

 Review crime descriptions and label with a 'true' alcohol label

Flag	Alcohol-related?
Crime description	×
Crime description	
Crime description	
Crime description	×

Training (80% data)

 Review crime descriptions and label with a 'true' alcohol label



#### Training (80% data)

 Review crime descriptions and label with a 'true' alcohol label How do we determine if a crime is alcohol-related?

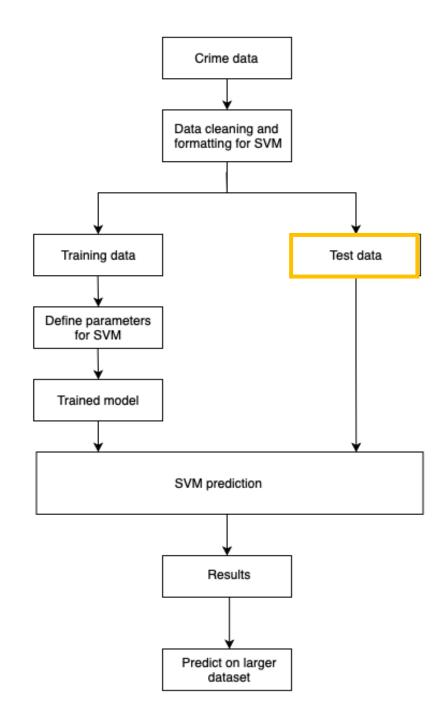
- Subjectively deciding
- Definitions
- Data analysis
  - 58% police flagged alcohol-related crimes contain violence-related terminology

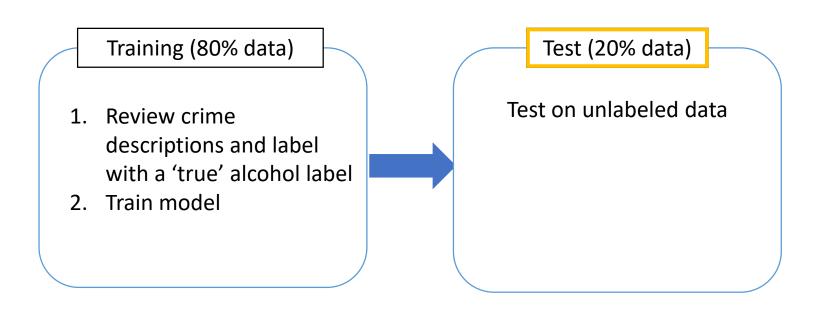
#### Training (80% data)

- Review crime descriptions and label with a 'true' alcohol label
- 2. Train model

How do we determine if a crime is alcohol-related?

- Subjectively deciding
- Definitions
- Data analysis
  - 58% police flagged alcohol-related crimes contain violence-related terminology

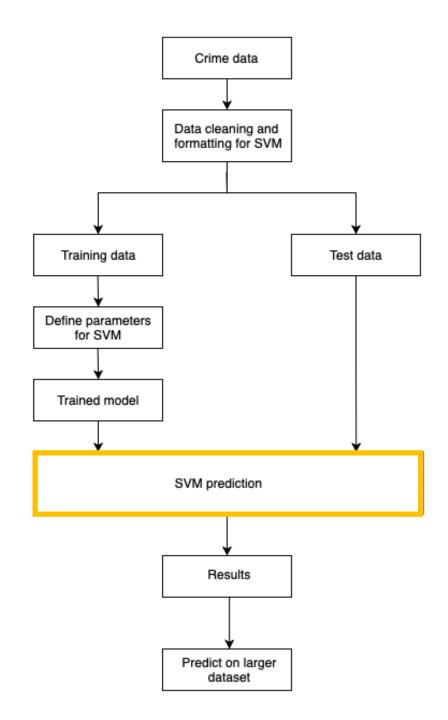


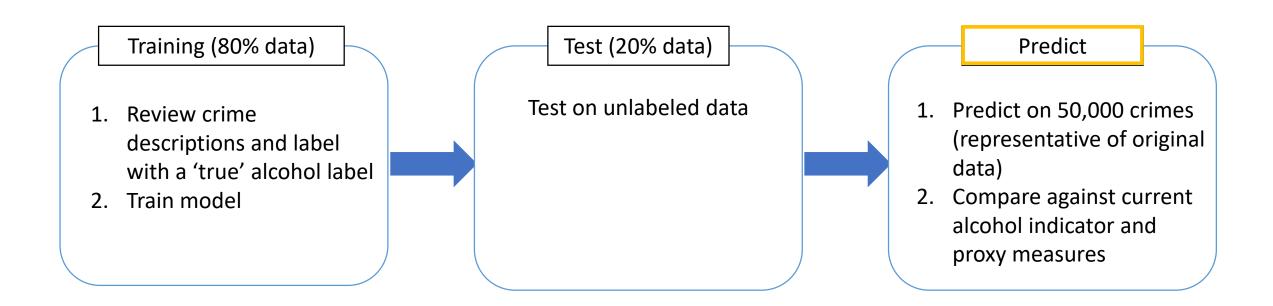


Test (20% data)

Test on unlabeled data

Accuracy	0.71
Misclassification rate	0.29
95% CI	0.62, 0.79
Карра	0.42
Sensitivity	0.69
Specificity	0.73
F-score	0.71





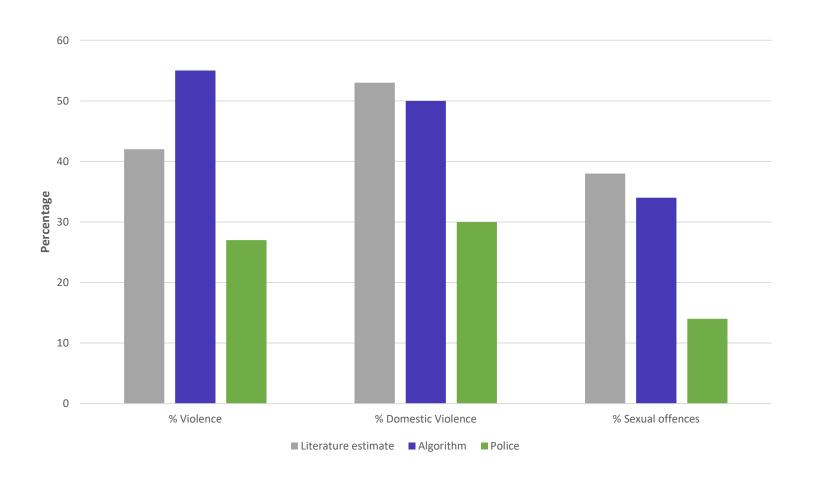
## Results

Flag	Count	Percentage
Dalias	C 200	12.0
Police	6,398	12.8
Keyword	6,930	13.9
Time	8,234	16.5
Algorithm	15,526	31.1

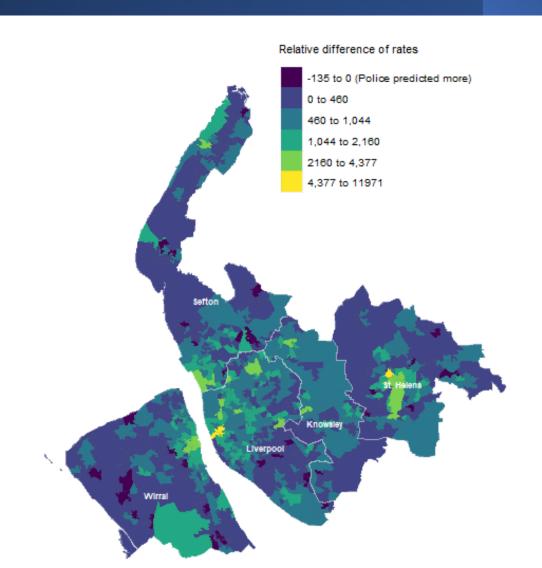
## Prediction validation – test accuracy on subset

Measure	Correctly predict alcohol-	
	related crime	
Police	76	
Algorithm	82	

# Results | Crime type



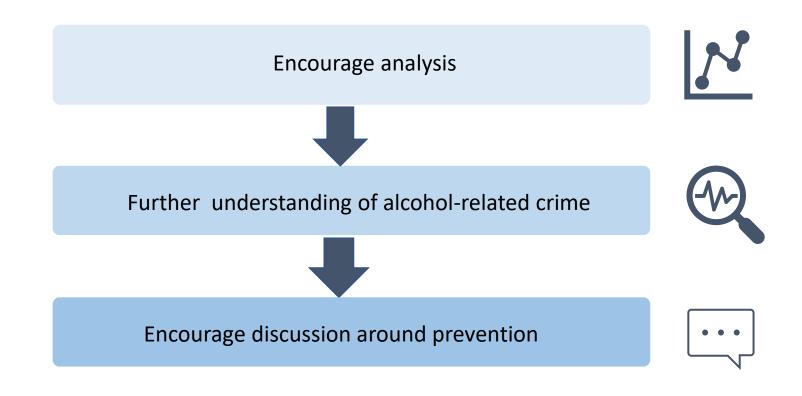
## Results | Alcohol-related crime mapped



### **Impact**

Our approach may have improved *estimates* of alcohol-related crime, but also our understanding of its *nature* 

### **Impact**



### Limitations

- Small training data size due to time restraints
- Ambiguity around definition
- Police data

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Thank you!

