

# Implementation of Ion Beam Analysis for forensic applications: The way to Global Forensic Database through the unification of different analytical techniques

Olga Girshevitz



# Contents

## Ion Beam Analysis and Forensics:

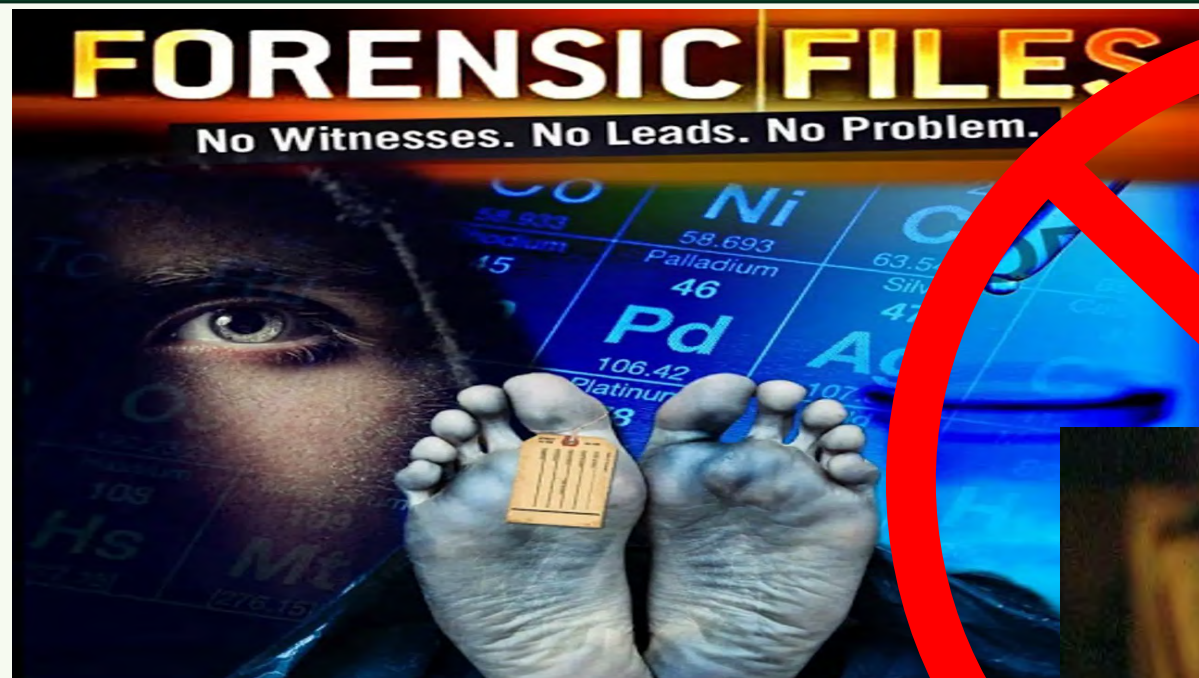
- What do Forensic Analysts need to consider in choosing an analytical method?
- Why using Ion Beams methods for analysis in Forensics?
- Trends
- Can IBA be useful in Forensics?

## Implementation of the IBA methods for unified modellable database of Car glass

- Same analytical method (PIXE) vs different laboratories
- Complementary PIXE/LA-ICP-MS/PGAA/PIGE/INAA/EDS
- Combination of the various IBA techniques and Machine Learning tools as the way to a reliable classification model

## Open questions





In forensic science:

1. the work begins on the crime scene and finishes in court;
2. there are no magic wands;
3. items need to be collected, analysed and results need forensic interpretation



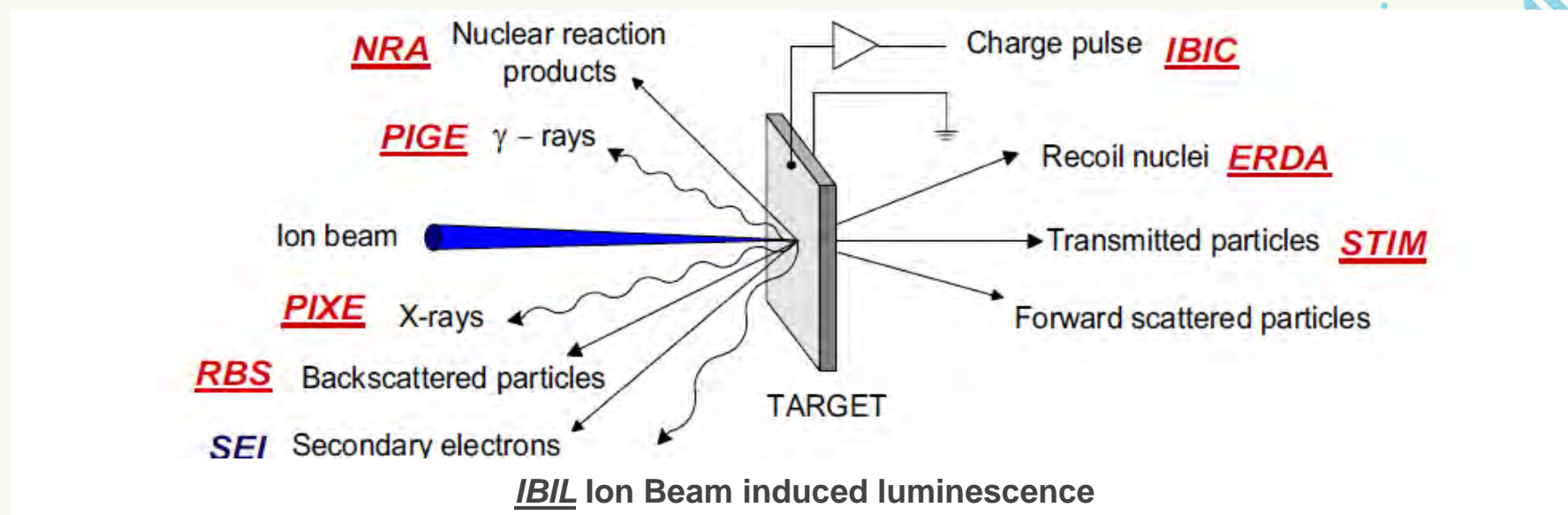




- ❖ **Sample size**
- ❖ **Destructive or non-destructive**
- ❖ **Availability of instrumentation, cost and operation**
- ❖ **Total analysis time**
- ❖ **Sample preparation requirements**
- ❖ **Quantitative or qualitative required**
- ❖ **What level of analysis is required (e.g.,  $\pm 1.0\%$  or  $\pm 0.001\%$ )**
- ❖ **Detection levels and useful analytical concentration ranges**
- ❖ **Admissibility (e.g., are all fragments compositionally the same or are there sufficient variations among “known” fragments of the world to link two samples)**



# ➤ Ion Beam Analysis Methods



Identification and quantification of the elements + depth distribution using MeV ion beams:

- ✓ PIXE
- ✓ RBS
- ✓ ERDA
- ✓ NRA

Characterization (density, charge transport, chemical bonds, morphology, crystallinity) with MeV ion beams:

- ✓ STIM (density)
- ✓ IBIC (charge transport)
- ✓ Channeling (crystallinity)
- ✓ SEI (morphology)
- ✓ IBIL (chemical bonds, impurities, structural defects)



# ➤ Why using Ion Beams methods for analysis in Forensics?

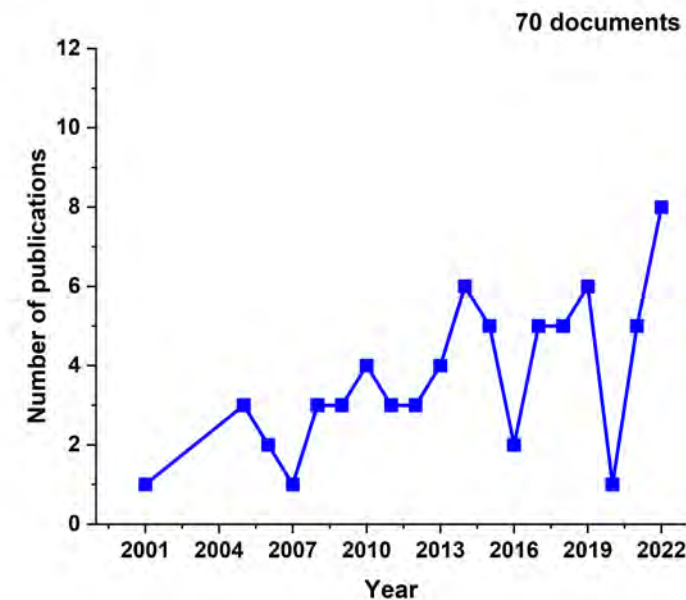
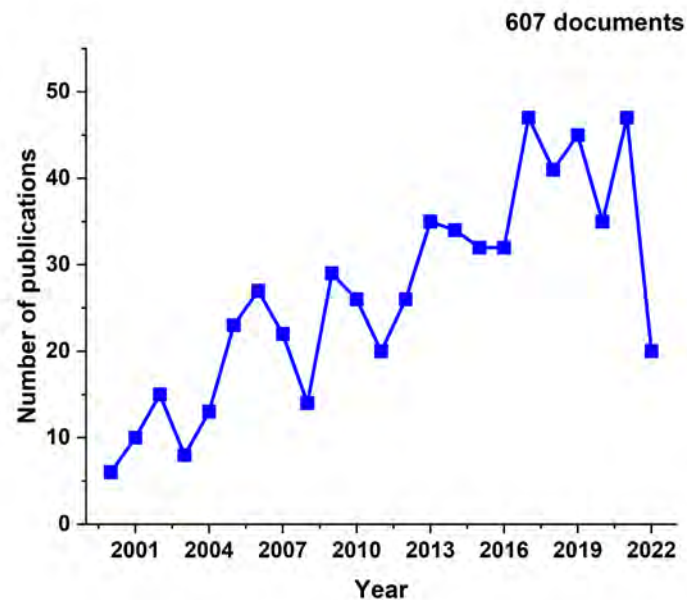
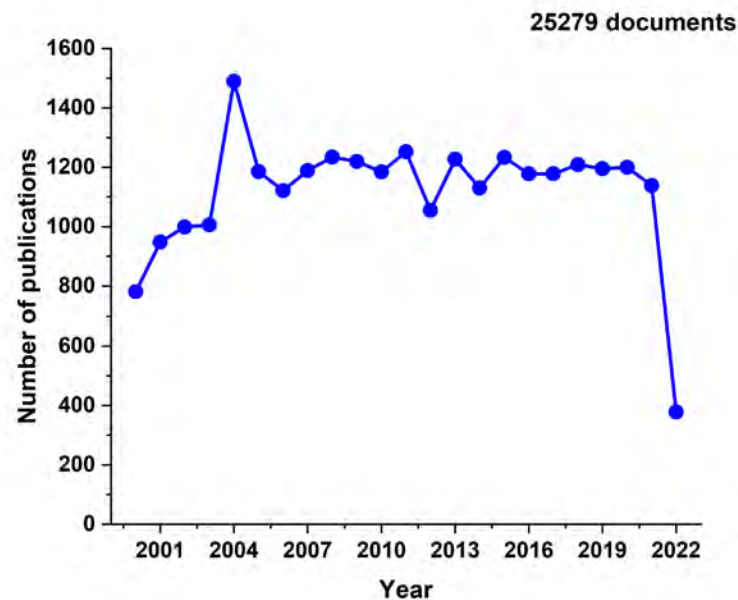
- ✓ Non –destructive. The samples remain intact during the analysis, which means evidence or artifacts can then be further evaluated using additional methods to gather more information
- ✓ Very high sensitivity to trace elements
- ✓ Fully quantitative and absolute
- ✓ Can produce elemental maps on a sub micron scale
- ✓ Measurements in vacuum or in air
- ✓ Accurate / reproducible
- ✓ Highly discriminating
- ✓ Need no sample preparation

## Negative points:

- ✓ Not portable
- ✓ Not reasonable time
- ✓ Not cheap



# ➤ IBA and Forensics trends



Results of SCOPUS search with topic “IBA”

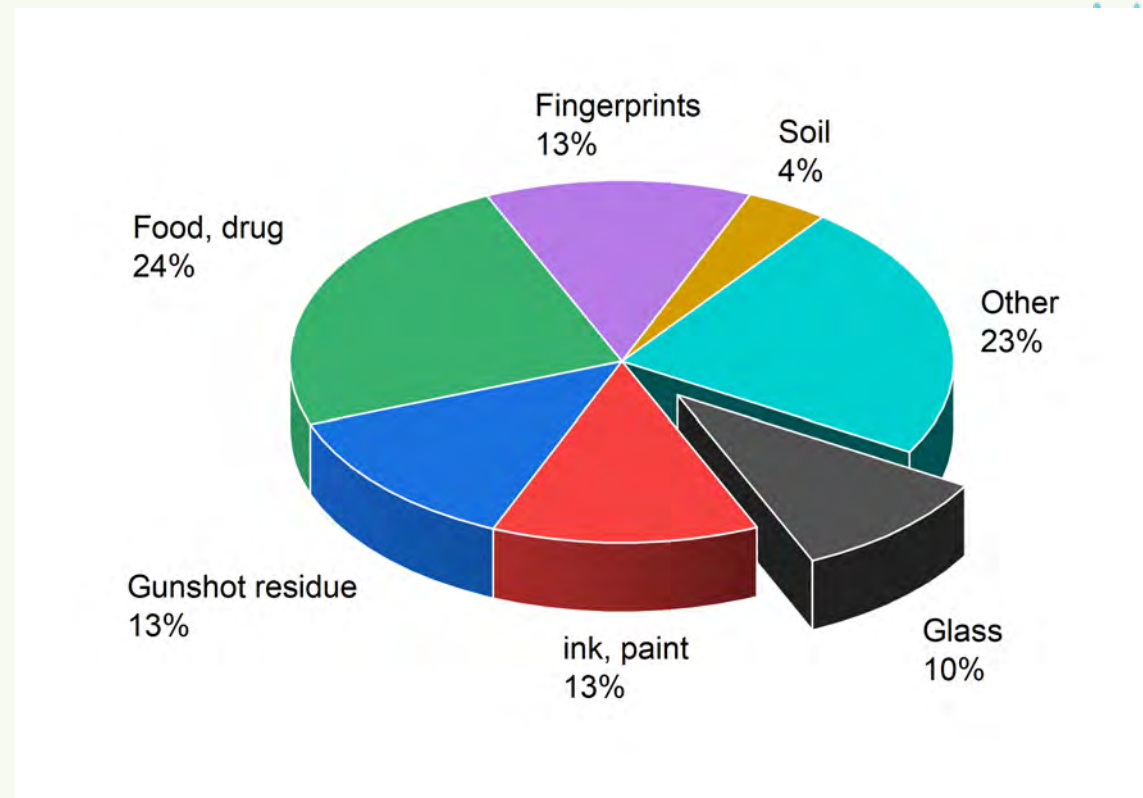
Results of SCOPUS search with topics “elemental analysis” and “ forensic”

Results of search with topics “forensic” and “IBA”

0.3% from the all IBA publications  
11.4% from the all publications that  
include topics “elemental analysis”  
and “forensic”



## ➤ Can IBA be useful in Forensics?



**Results of SCOPUS search demonstrate % of the different forensic materials that were analyzed by “IBA” in the period between 2000-2022**





# Can IBA be useful in Forensics?

Nuclear Instruments and Methods in Physics Research B 268 (2010) 1929–1932

Contents lists available at ScienceDirect

Nuclear Instruments and Methods in Physics Research B

journal homepage: [www.elsevier.com/locate/nimb](http://www.elsevier.com/locate/nimb)



## Depth profiling of fingerprint and ink signals by SIMS and MeV SIMS

M.J. Bailey<sup>a,\*</sup>, B.N. Jones<sup>a</sup>, S. Hinder<sup>b</sup>, J. Watts<sup>b</sup>, S. Bleay<sup>c</sup>, R.P. Webb<sup>a</sup>

<sup>a</sup>University of Surrey Ion Beam Centre, Surrey GU2 7XH, UK

<sup>b</sup>Surface Analysis Laboratory, University of Surrey, GU2 7XH, UK

<sup>c</sup>Home Office Scientific Development Branch, St. Albans, UK

- ❖ SIMS and MeV SIMS used in determination of the deposition order of a doped fingerprint and written text
- ❖ the sequence can be determined with MeV SIMS
- ❖ the problem arises for real case fingerprints which are developed by fingerprint reagents

Forensic Science International 331 (2022) 111136

Contents lists available at ScienceDirect

Forensic Science International

journal homepage: [www.elsevier.com/locate/forsclint](http://www.elsevier.com/locate/forsclint)



## Comparison of optical techniques and MeV SIMS in determining deposition order between optically distinguishable and indistinguishable inks from different writing tools

Marko Barac<sup>a,\*</sup>, Andrijana Filko<sup>b</sup>, Zdravko Siketić<sup>a</sup>, Marko Brajković<sup>a</sup>, Andrea Ledić<sup>b</sup>, Iva Bogdanović Radović<sup>a</sup>

<sup>a</sup>Division of Experimental Physics, Ruđer Bošković Institute, Bijenička 54, 10000 Zagreb, Croatia

<sup>b</sup>Forensic Science Centre "Ivan Vučetić", Illica 335, 10000 Zagreb, Croatia

- ❖ MeV SIMS used in correlation with optical techniques for distinguishing inks in writing tools
- ❖ added value in determining the deposition order and ink line intersections
- ❖ MeV SIMS more efficient for distinguishing oil-based inks



# Can IBA be useful in Forensics?

Forensic Science International 231 (2013) 219–228

Contents lists available at SciVerse ScienceDirect

Forensic Science International

journal homepage: [www.elsevier.com/locate/forsciint](http://www.elsevier.com/locate/forsciint)



ELSEVIER



## Integrated Ion Beam Analysis (IBA) in Gunshot Residue (GSR) characterisation

F.S. Romolo<sup>a,b,\*</sup>, M.E. Christopher<sup>c</sup>, M. Donghi<sup>d</sup>, L. Ripani<sup>e</sup>, C. Jeynes<sup>c</sup>, R.P. Webb<sup>c</sup>, N.I. Ward<sup>f</sup>, K.J. Kirkby<sup>c</sup>, M.J. Bailey<sup>f</sup>

<sup>a</sup>Dipartimento di Scienze Anatomiche, Istologiche, Medico-Legali e dell'Apparato Locomotore, SAPIENZA Università di Roma, Italy

<sup>b</sup>Institut de Police Scientifique, Université de Lausanne, Switzerland

<sup>c</sup>Surrey Ion Beam Centre, University of Surrey, Guildford, Surrey GU2 7XH, United Kingdom

<sup>d</sup>Reparto Investigazioni Scientifiche Carabinieri, Parma, Italy

<sup>e</sup>Reparto Investigazioni Scientifiche Carabinieri, Roma, Italy

<sup>f</sup>Department of Chemistry, University of Surrey, Guildford, Surrey GU2 7XH, United Kingdom

## ❖ IBA in conjunction with SEM-EDS

❖ PIXE – added value: lower detection limit than EDS; detection of Hg from the mercury fulminate primers

❖ PIGE – added value: identification of light elements, boron and sodium

## PLOS ONE

### RESEARCH ARTICLE

## Molecular imaging of human hair with MeV-SIMS: A case study of cocaine detection and distribution in the hair of a cocaine user

Luka Jeromel<sup>1</sup>, Nina Ogrinc<sup>2\*</sup>, Zdravko Siketić<sup>3</sup>, Primož Vavpetič<sup>1</sup>, Zdravko Rupnik<sup>1</sup>, Klemen Bučar<sup>1</sup>, Boštjan Jenčič<sup>1</sup>, Mitja Kelemen<sup>1</sup>, Matjaž Vencelj<sup>1</sup>, Katarina Vogel-Mikuš<sup>1,4</sup>, Janez Kovač<sup>1</sup>, Ron M. A. Heeren<sup>2</sup>, Bryn Flinders<sup>2</sup>, Eva Cuypers<sup>2,5</sup>, Žiga Barba<sup>1\*</sup>, Primož Pelicon<sup>1</sup>

<sup>1</sup> Jožef Stefan Institute, SI-Ljubljana, Slovenia, <sup>2</sup> The Maastricht Multimodal Molecular Imaging Institute, Maastricht University, ER Maastricht, Maastricht, The Netherlands, <sup>3</sup> Rudjer Bošković Institute, Zagreb, Croatia, <sup>4</sup> Department of Biology, Biotechnical Faculty, University of Ljubljana, Ljubljana, Slovenia, <sup>5</sup> KU Leuven Toxicology & Pharmacology, Leuven, Belgium

\*Current address: Univ. Lille, Inserm, CHU Lille, U1192 - Protéomique Réponse Inflammatoire Spectrométrie de Masse – PRISM, Lille, France

\* [ziga.barba@ijs.si](mailto:ziga.barba@ijs.si)



❖ MeV SIMS used for determination of the cocaine concentration profile along the growth axis of human hair

❖ High chemical sensitivity and non-destructive characterization

❖ Ability to reconstruct a detailed history of cocaine intake





# Can IBA be useful in Forensics?



❖ IBA – PIXE and MeV SIMS successful discrimination between the legal and illegal products

❖ INAA – elemental quantification and future implementation of an interlaboratory classification system

**Non-destructive vs destructive**

preserving the integrity of the samples is mandatory!

❖ IBA (PIXE and PIGE) in conjunction GC-MS and HPLC-HRMS

❖ added value of IBA – light (PIGE) and heavy elements (PIXE) determination for discrimination between legal and illegal products

❖ Foundation for an inter-laboratory classification system based on chromatography, MS and IBA measurements



# Car glass classification by IBA methods as a part of the forensic workflow



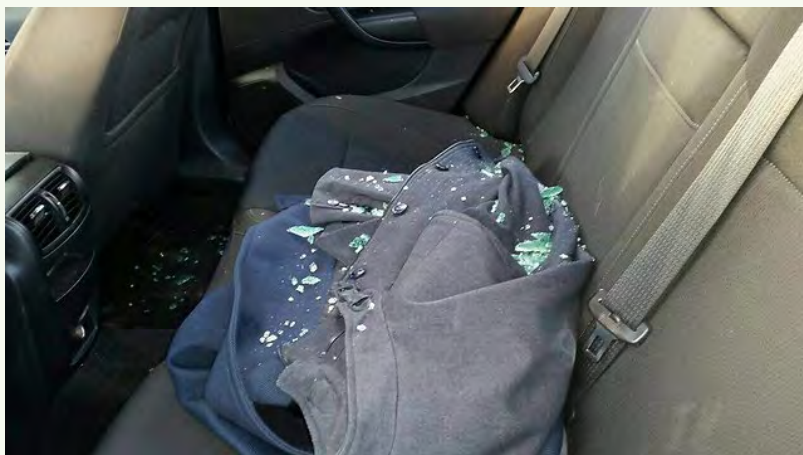
**Every year, the Israeli Police Force reports on dozens of crimes that involved glass fragment as evidence which did not realize their forensic potential.**





# Forensic problem

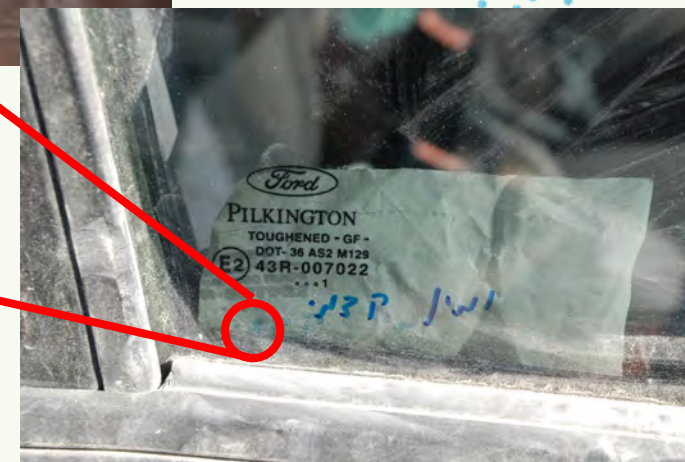
One of the frequent forensic problems is linking of the evidence to the crime scene.



## Glass characterization parameters:

- Size
- Color
- Refractive Index (RI)
- Elemental composition\*\*\*

\*\*\***Difficulty:** Improvement in glass manufacturing techniques and higher standard rigidity



"This fragment came from a Ford!"



## In the previous episodes:



### CSI – Bar-Ilan

#### Proposed remedy:

- Characterize glass fragments by its elemental composition
- Apply Machine Learning (ML) models for classification

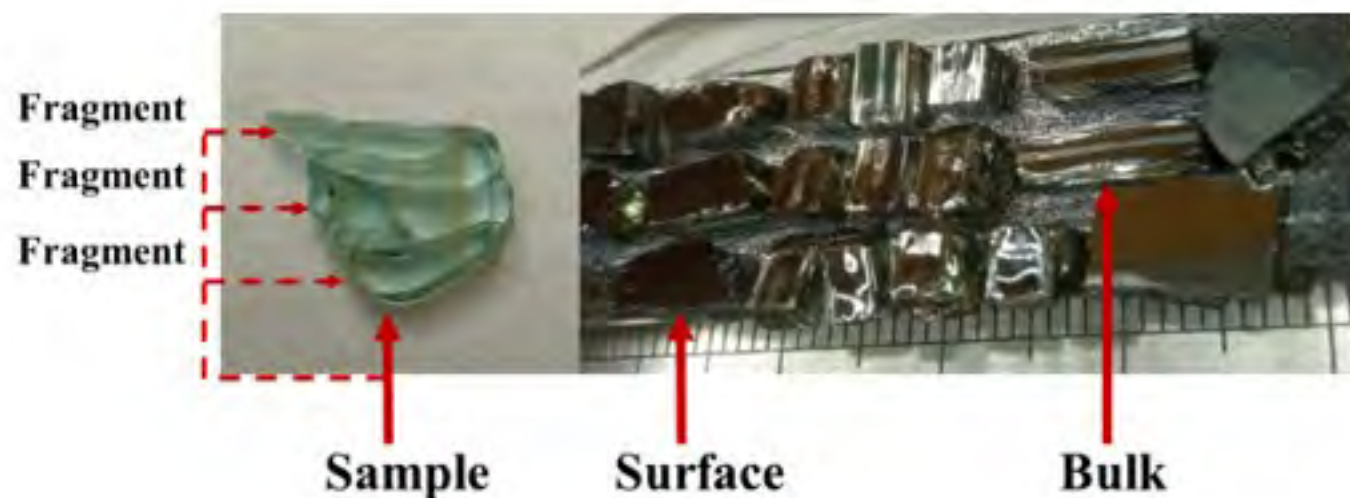




Israel Police HQ, Toolmarks and Materials Lab provided:

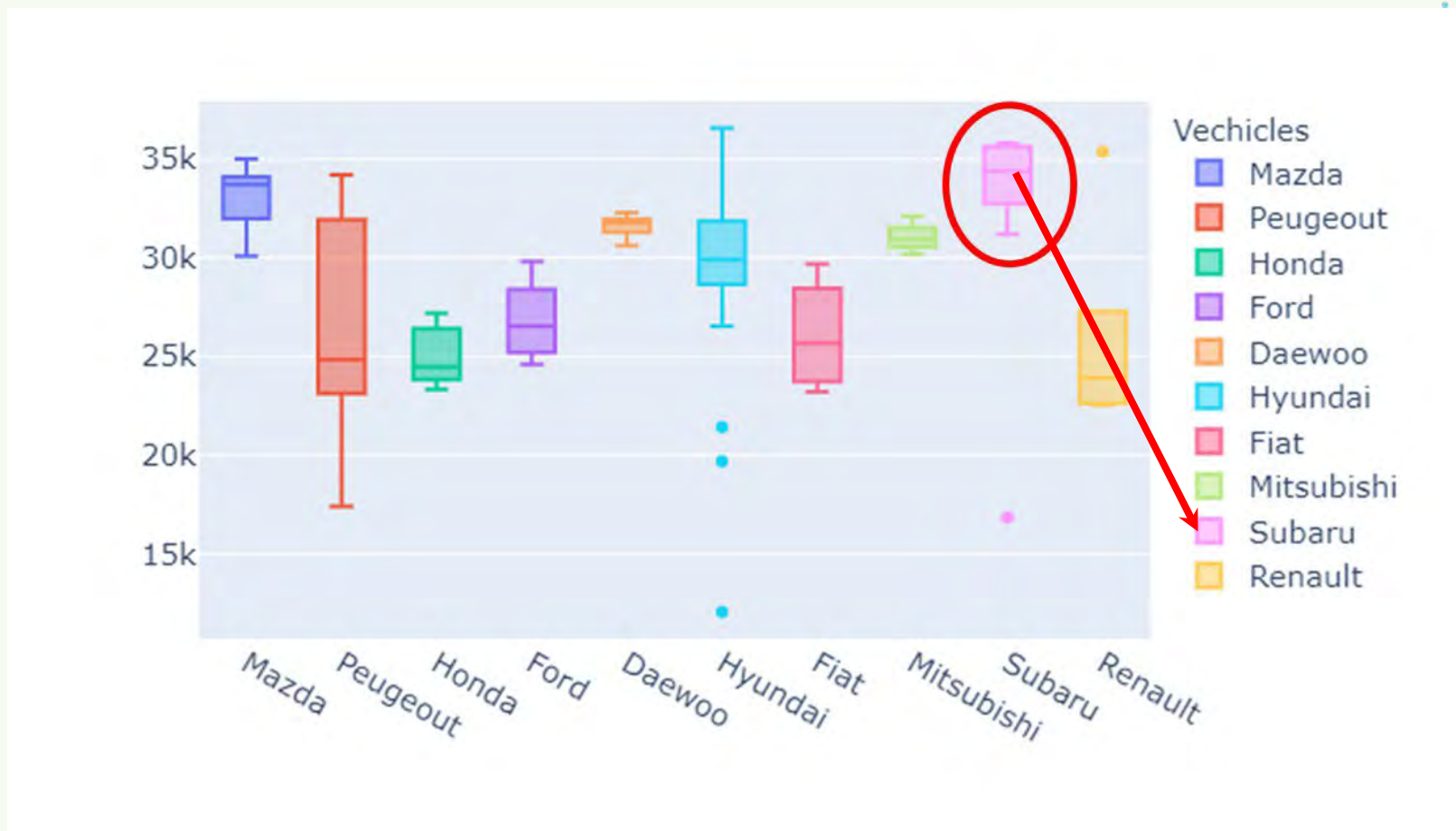
### 48 Samples:

- 13 vehicles
- 10 car manufacturers





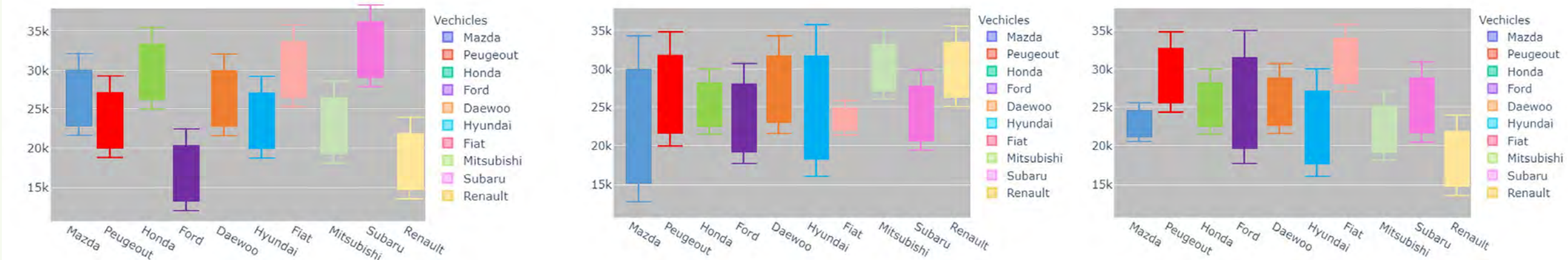
# Amount of the specific element (K) as a differentiator



The boxplot represent the distribution of a single element, K, partitioned by manufactures



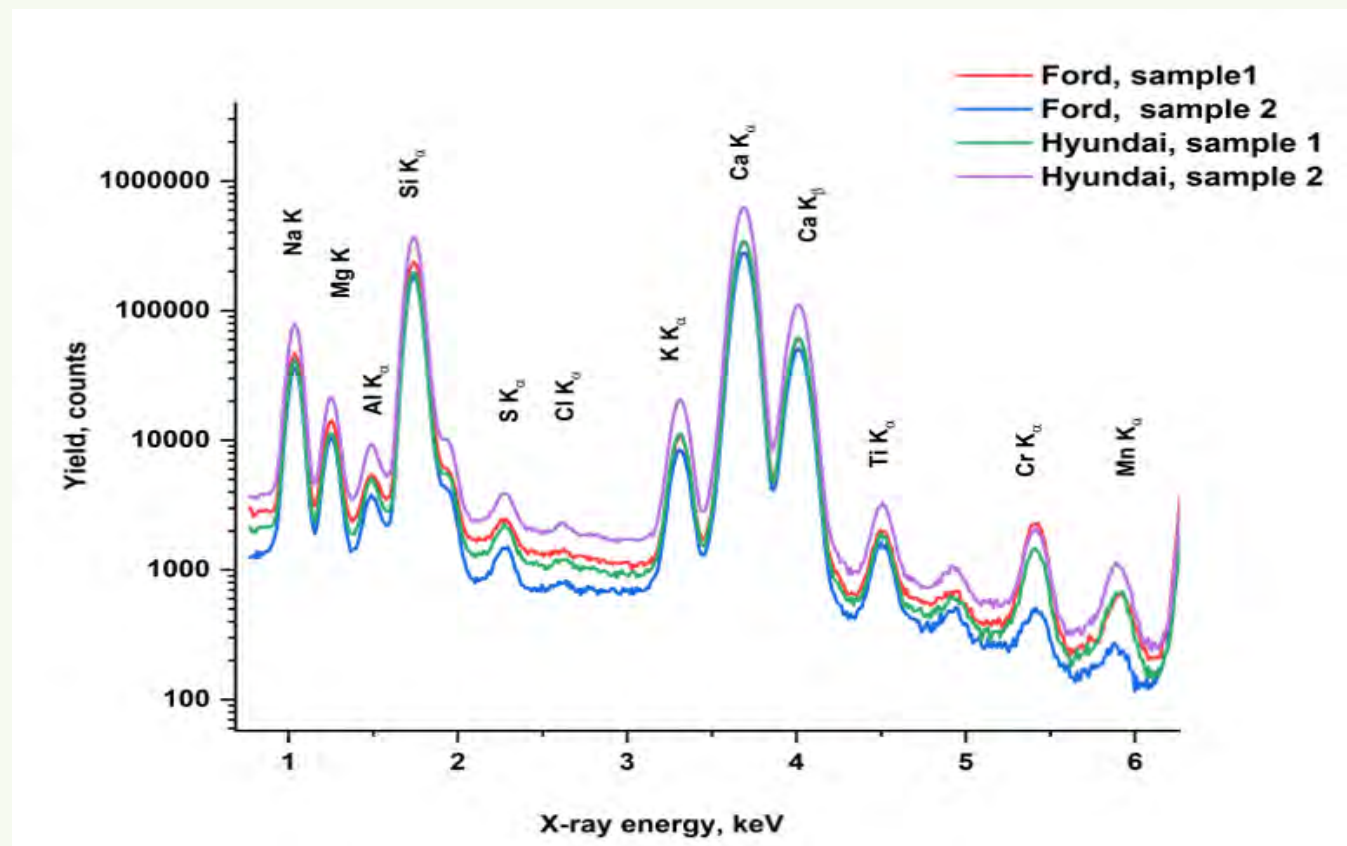




**If a manufacture doesn't display distinct differences in any of the elements, it will not be distinguished.**



## Is a big picture informative enough?

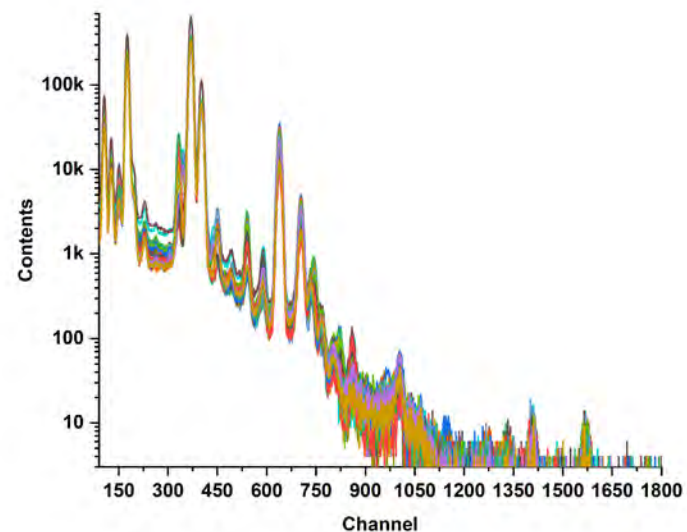


....no particular orderliness between manufacturers

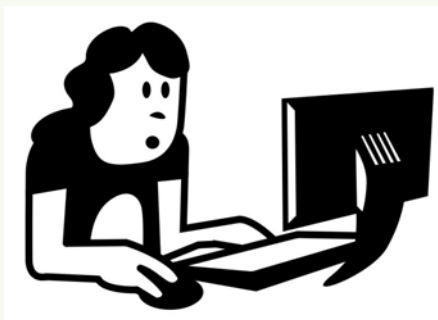
**When Human learning has fails, one moves on to Machine Learning (ML)**



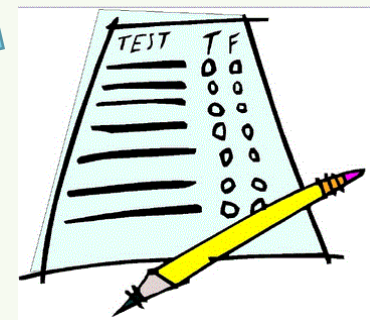
# The idea behind ML



70% - to study



30% - to test

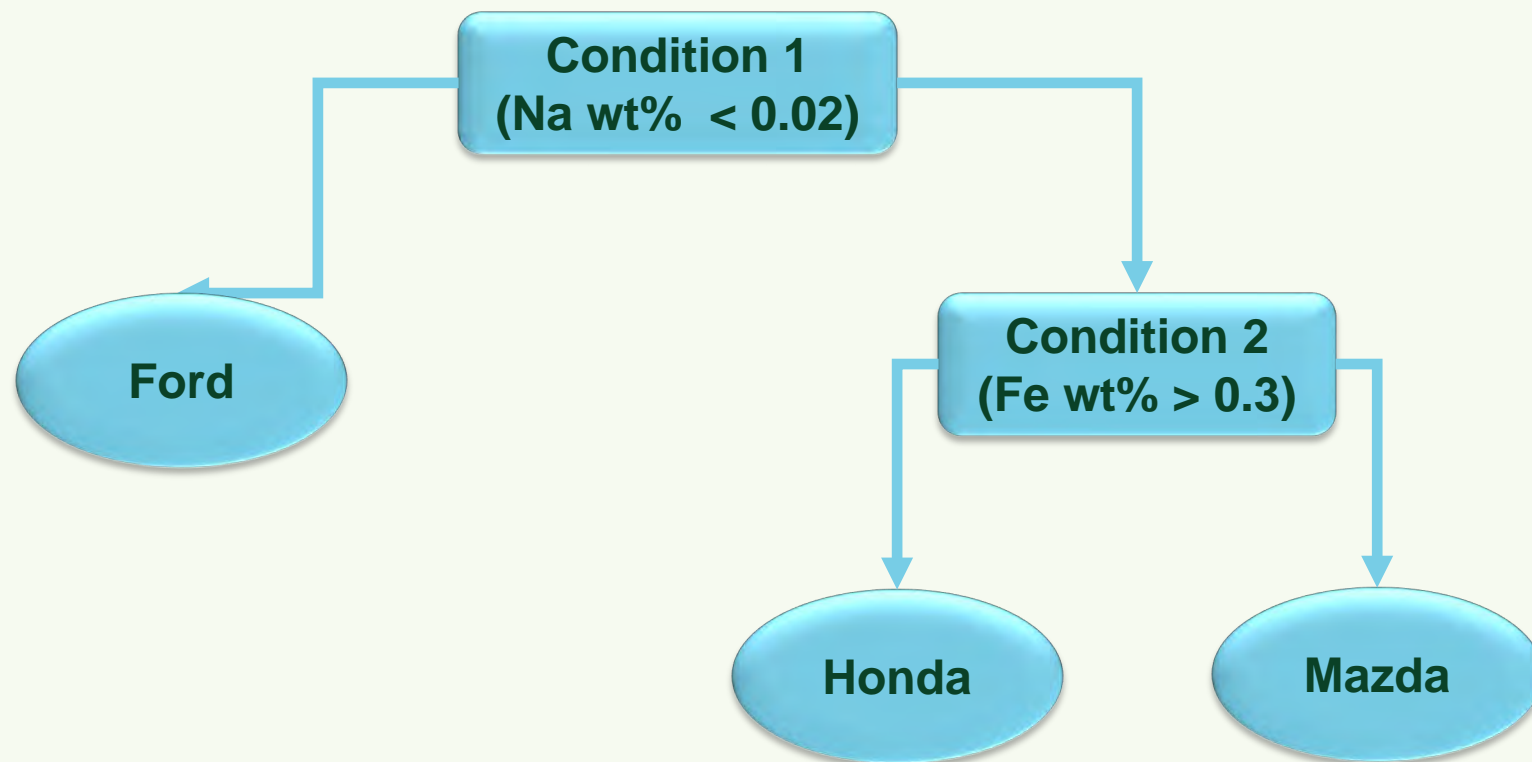


Evaluation of model on test set



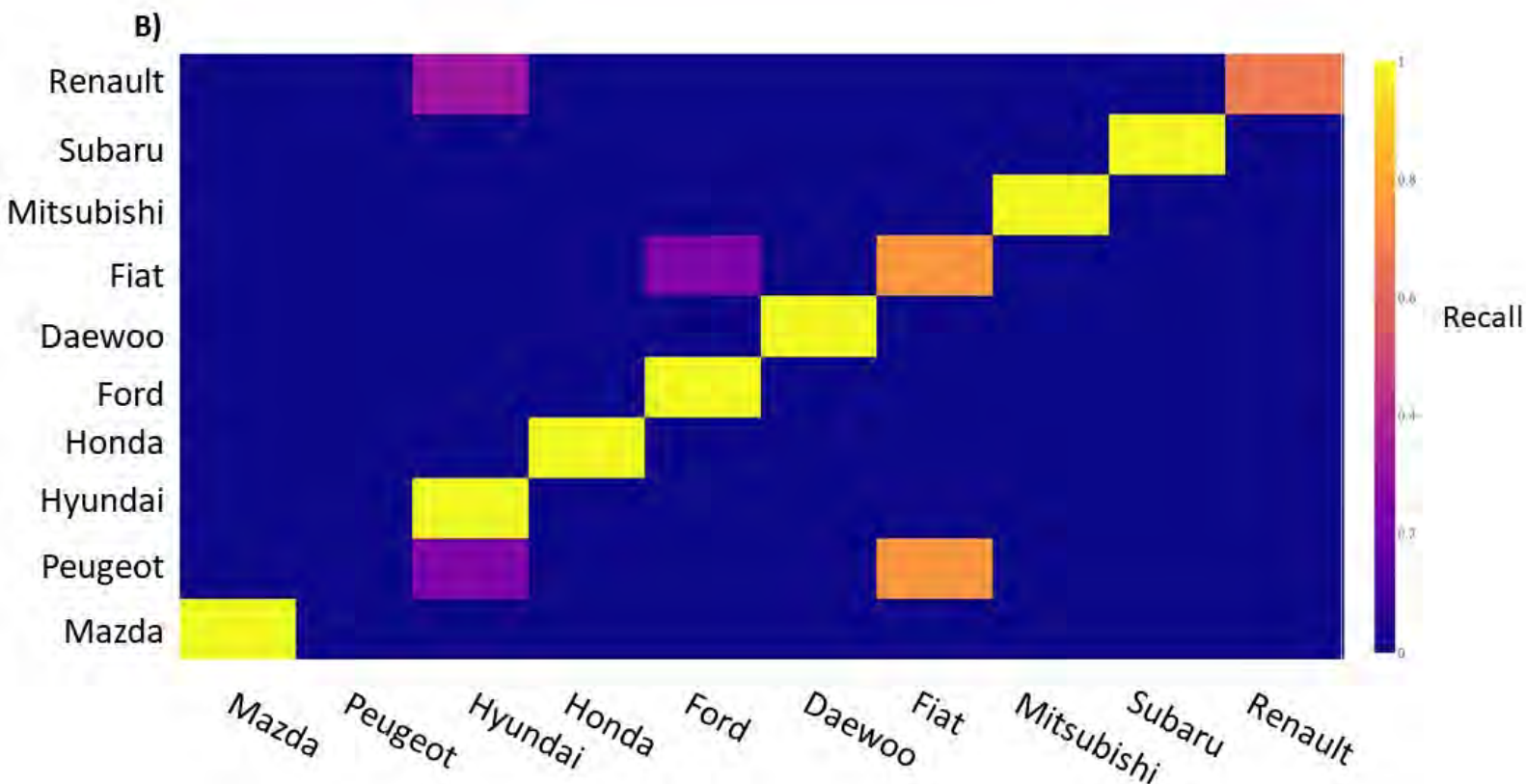
# The idea behind ML

## Decision Tree (Machine Learning Algorithm)





# New approach: Combination of two worlds – **PIXE+ML**



Confusion matrix demonstrates the performances of the classification model, % of correctly identified samples class.

Talanta 234 (2021) 122608

Contents lists available at ScienceDirect

Talanta

journal homepage: [www.elsevier.com/locate/talanta](http://www.elsevier.com/locate/talanta)

ELSEVIER

PIXE based, Machine-Learning (PIXEL) supported workflow for glass fragments classification

Omer Kaspi<sup>a</sup>, Olga Girshevitz<sup>b,\*</sup>, Hanoeh Senderowitz<sup>a,\*</sup>

<sup>a</sup> Department of Chemistry, Bar-Ilan University, Ramat-Gan, 5290002, Israel

<sup>b</sup> Bar-Ilan Institute of Nanotechnology and Advanced Materials, Bar-Ilan University, Ramat-Gan, 5290002, Israel

The combination of PIXE-based elemental analysis with ML algorithms can provide reliable models for assigning glass fragments taken from cars' windshields to one of several car manufacturers



# In the next episodes:

Rule of thumb for data analysis:

***“The more the merrier”***

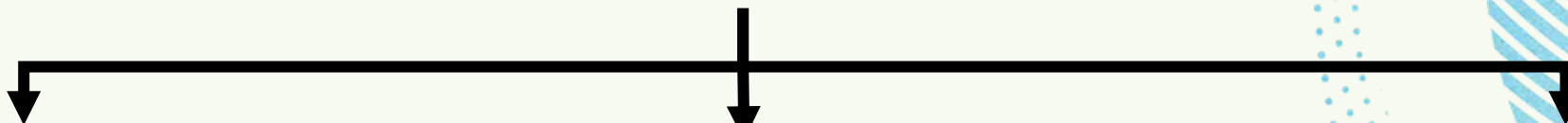
And that's why lab cooperation and information sharing is important

**A global forensic database**



# In the next episodes

The same samples were given to



**Division of Experimental Physics  
Ruđer Bošković Institute, RBI**



**Department of Chemistry and  
Institute of Nanotechnology  
Bar-Ilan University, BINA**

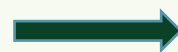


**Department of Physics  
University of Helsinki, HU**

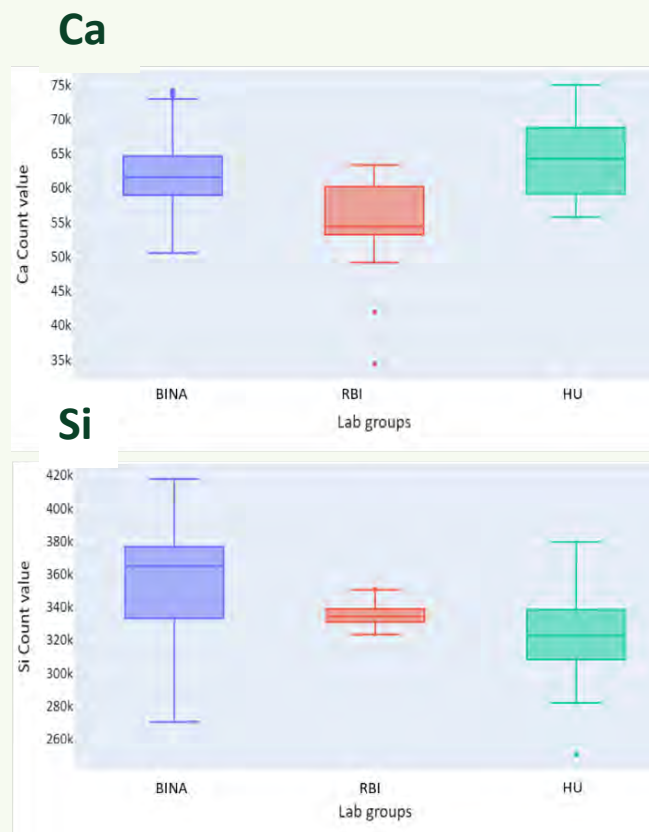


# Intercomparison between PIXE results of different laboratories

Train set – RBI data, test – BINA data



Result was not spectacular

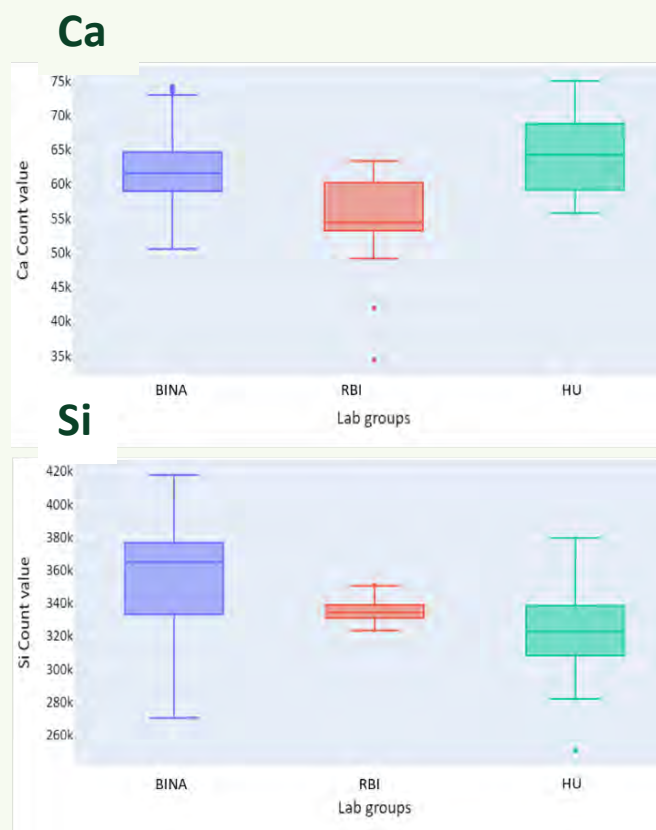


The measurements were performed using the different experimental setups

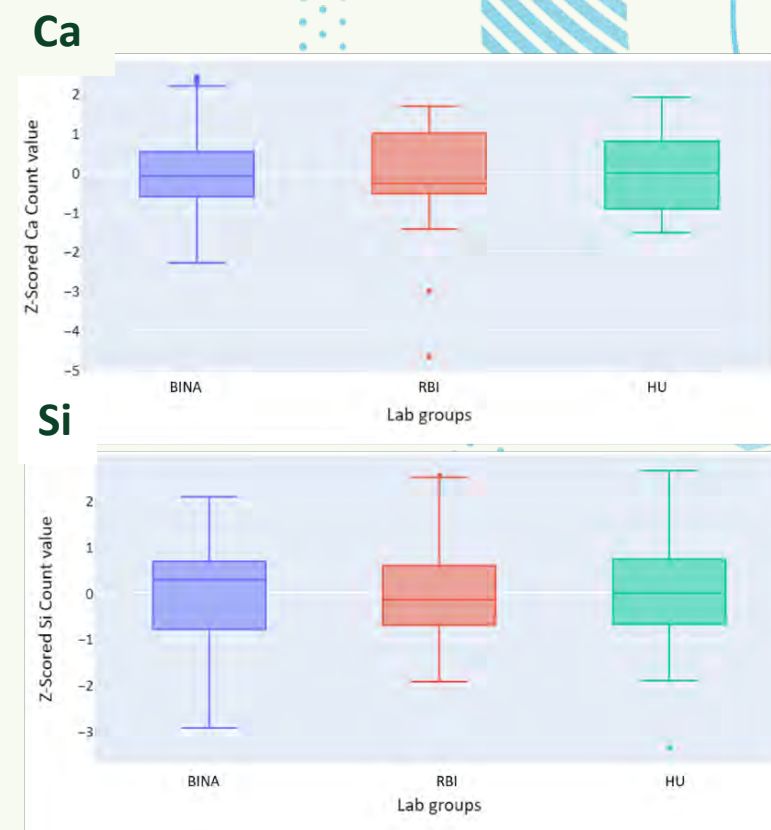




# Intercomparison between PIXE results of different laboratories



➔  
**Normalization process**



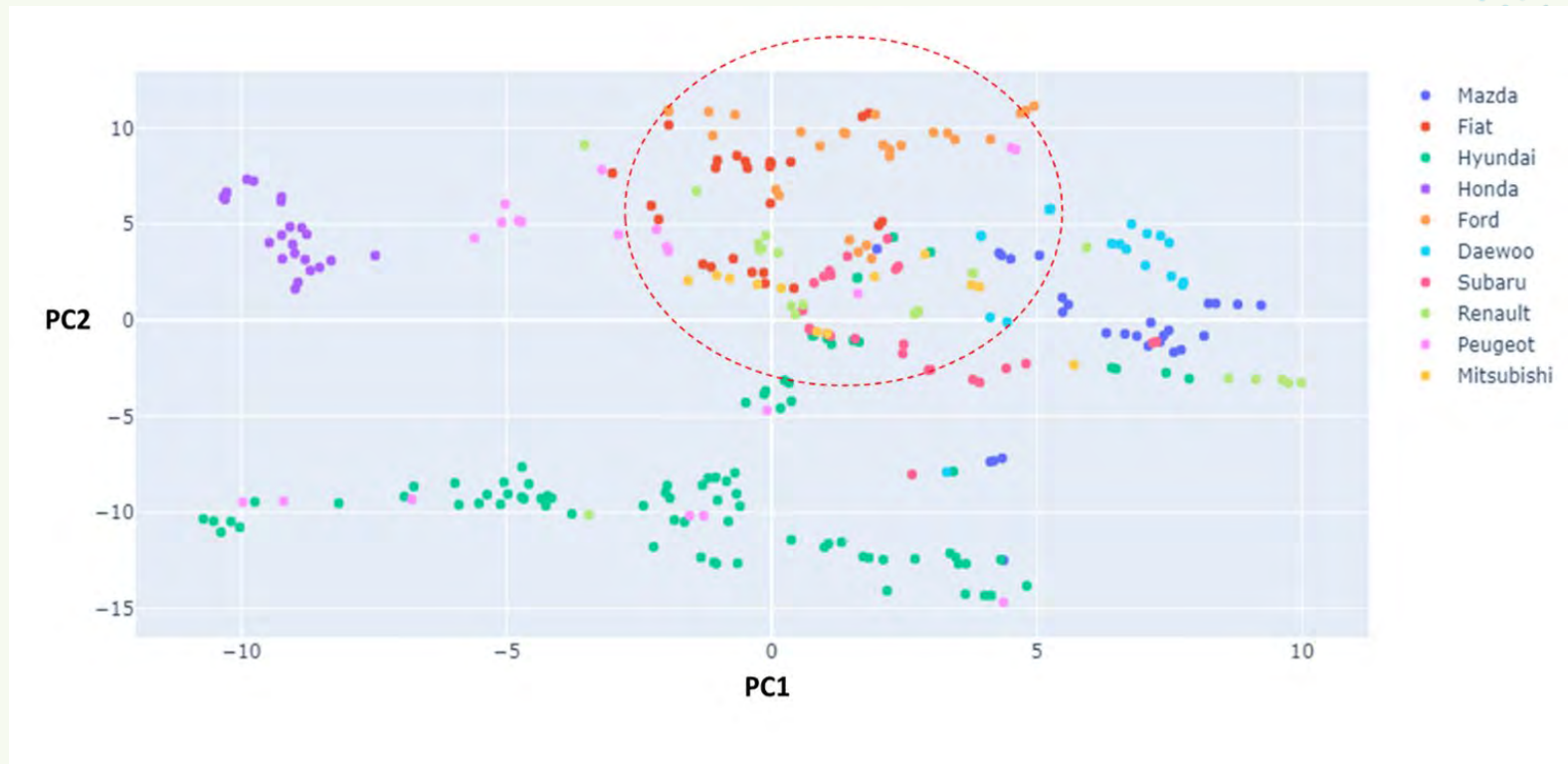
Comparison of measurements with different setups before (left) and after (right) normalization.

**Normalization of the data reduces variability that is caused by different measurement protocols and instruments.**



# Combination of PIXE results from different laboratories to unified database

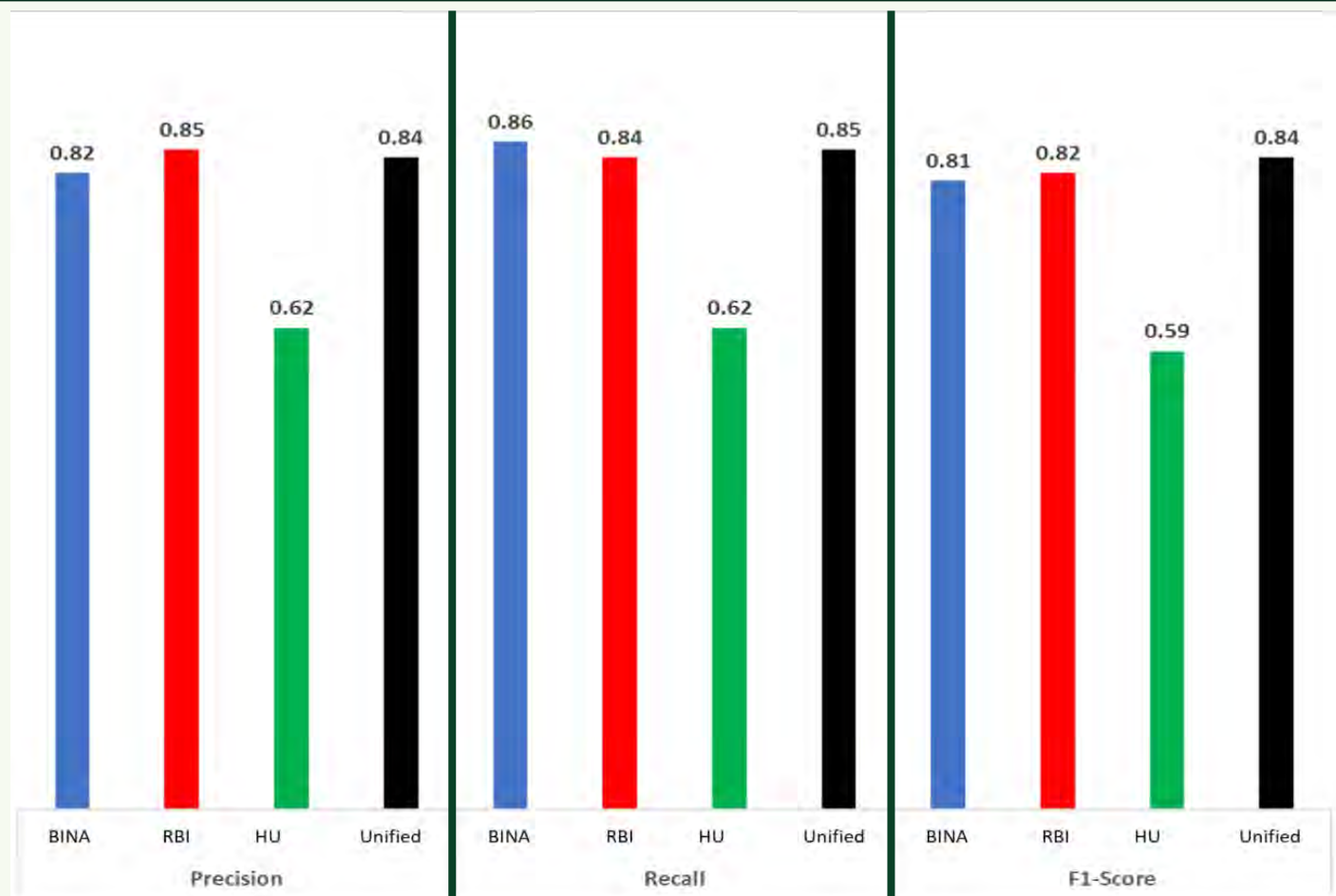
**The samples from the same manufacture are located in the same area , indifferent of the measuring lab.**



**Dimensionality reduction of the combined database using t-SNE method.**



# The power of the combining results



The model produced by the uniform database has performances metrics values equal or better of the best performing lab-specific model.





# The last episode:

## Classification of glass specimen using multiple analytical techniques measured in multiple laboratories

### Laboratories

### Alternate/Complement techniques

### Performances of lab-specific models

- BINA, Israel
- HU, Finland
- RBI, Croatia
- DIFS, Israel
- ATOMKI, Hungary
- BNC, Hungary
- BARC, India

- PIXE
- PIXE
- PIXE
- EDS
- LA ICP-MS
- PGAA
- INAA, PIGE



Lab group/method	Precision	Recall	F1 - Score
<b>BINA / PIXE</b>	$0.84 \pm 0.05$	$0.88 \pm 0.05$	$0.83 \pm 0.05$
<b>RBI / PIXE</b>	$0.84 \pm 0.05$	$0.87 \pm 0.05$	$0.83 \pm 0.05$
<b>HU / PIXE</b>	$0.65 \pm 0.08$	$0.66 \pm 0.13$	$0.61 \pm 0.10$
<b>BARC / INAA, PIGE</b>	$0.92 \pm 0.06$	$0.87 \pm 0.10$	$0.89 \pm 0.08$
<b>BNC / PGAA</b>	$0.52 \pm 0.25$	$0.48 \pm 0.26$	$0.49 \pm 0.25$
<b>ATOMKI / LA-ICP MS</b>	$0.79 \pm 0.09$	$0.76 \pm 0.12$	$0.76 \pm 0.10$
<b>DIFS / EDS</b>	$0.51 \pm 0.09$	$0.52 \pm 0.11$	$0.48 \pm 0.10$

Samples Collection: 48 glass specimens from 13 different car models from 10 car manufacturers were collected and recorded. The same specimens that were previously measured by PIXE were now provided to all labs for analysis by other techniques



# Agreement between labs on features' importance

Chosen by:	BINA, PIXE	RBI, PIXE	HU, PIXE	BARC, PIGE +INAA	BNC, PGAA	ATOMKI, LA ICP-MS	DIFS EDS
K	X	X	X	*	X		X
Al	X	X	X		X		X
Ti	X	*	X	*	X		*
Fe	X	X	X		X	X	X
Mn	X	X	*	*			*
Ca	X	X	X		*	X	*
Mg		X	*				X
Zn	X	*	*	X	*		*
Si		X	X		X		X
Cr		X	*		*	*	*
S		X	*	*	*	*	*
Na		X	*		X		X
Ce, Zr, Rb, Eu	*	*	*	X	*		*
Sc, Co	*	*	*	X	*	*	*
La	*	*	*	X	*	X	*
Gd, B	*	*	*	*	X		*
Cl	*	*	*	*	X	*	*
Pr, As, Bi	*	*	*	*	*		*

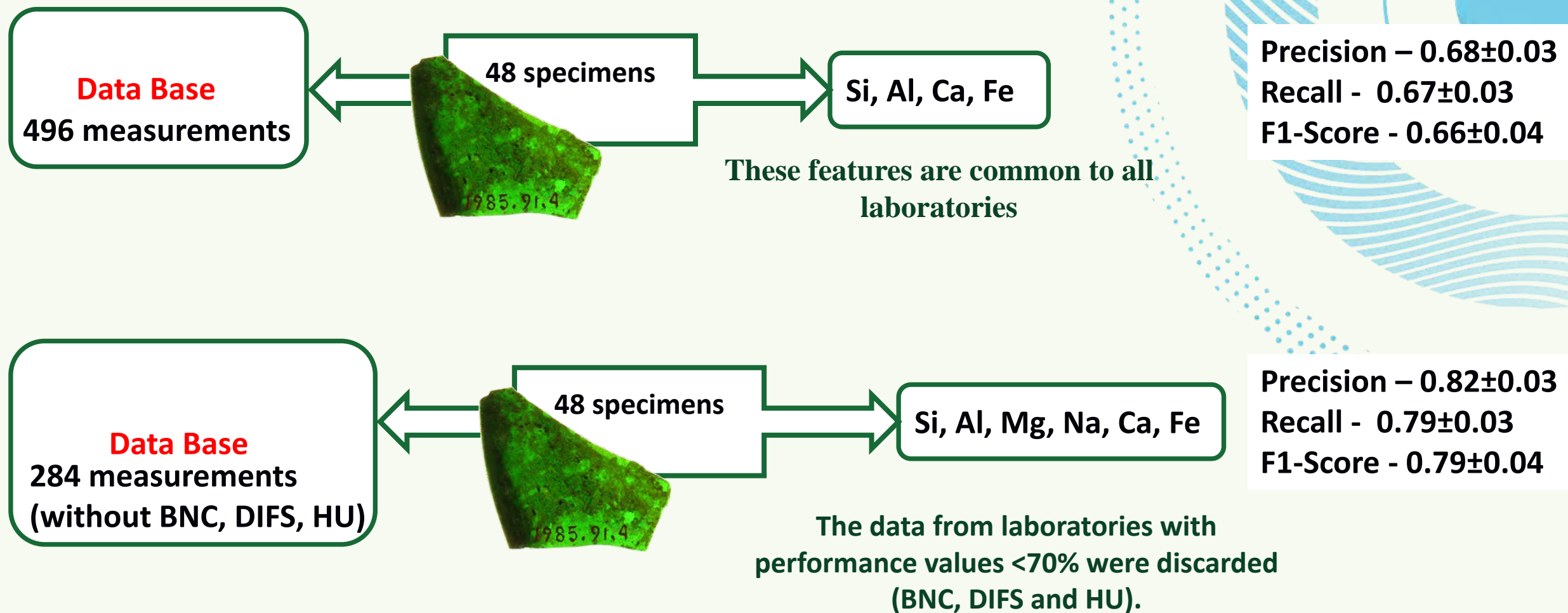
**X** - features that were measured and found among the ten topmost important features.

**Empty cells** - features that were measured but not determined to be within the ten topmost important features.

**\*** - elements that were not measured by the specific lab.



# How can we get better?





# How can we get better?

## Performances of models derived from combinations of different techniques

	PIXE	PIGE +INAA	LA-ICP-MS	EDS
PIXE	P: $0.87 \pm 0.04$ R: $0.90 \pm 0.03$ F1: $0.87 \pm 0.05$	P: $0.78 \pm 0.05$ R: $0.81 \pm 0.04$ F1: $0.77 \pm 0.05$	P: $0.92 \pm 0.02$ R: $0.93 \pm 0.02$ F1: $0.92 \pm 0.03$	P: $0.81 \pm 0.04$ R: $0.84 \pm 0.03$ F1: $0.81 \pm 0.05$
PIGE + INAA		P: $0.92 \pm 0.06$ R: $0.87 \pm 0.10$ F1: $0.89 \pm 0.08$	P: $0.86 \pm 0.06$ R: $0.83 \pm 0.09$ F1: $0.83 \pm 0.07$	P: $0.49 \pm 0.06$ R: $0.50 \pm 0.09$ F1: $0.46 \pm 0.07$
LA-ICP-MS			P: $0.79 \pm 0.09$ R: $0.76 \pm 0.12$ F1: $0.76 \pm 0.10$	P: $0.88 \pm 0.06$ R: $0.89 \pm 0.06$ F1: $0.86 \pm 0.07$
EDS				P: $0.51 \pm 0.09$ R: $0.52 \pm 0.11$ F1: $0.48 \pm 0.10$

➤ Combining measurements from two labs leads to models which are significantly better than the lower-performing model of the two labs and are only slightly worse than the higher-performing model.

➤ BARC produces high quality classification models using a completely different features set than used by all other methods

In order to participate in the unified DB it is not sufficient for it to be able to properly measure samples and construct a good predictive model but also to be able to construct good predictive models using the important features as determined by other labs.



# For the next episodes, open questions are:

- ❖ Will model performances be improved if models will be derived from the raw spectra?
- ❖ Can the model application be expended to identify glasses that do not origin from vehicles? Or other forensic materials?
- ❖ Is it feasible to create a web-based database? And to use it as new reference to point out specific differences in the results that come from specific laboratories?



The most work on the glass was carried out under the IAEA Coordinated Research Project on “Enhancing Nuclear Analytical Techniques to Meet the Needs of Forensic Sciences” (F11021), 2017-2021

<u>BINA Team</u>	<u>RBI Team</u>	<u>HU Team</u>	<u>BNC Team</u>	<u>BARC Team</u>	<u>ATOMKI Team</u>	<u>Israeli Police</u>
<b>Olga Girshevitz</b>  <b>Hanoch Senderowitz</b>  <b>Omer Kaspi</b>	<b>Iva Bogdanović Radović</b>  <b>Matea Krmpotić</b>  <b>Sabrina Gouasmia</b>	<b>Jyrki Räisänen</b>  <b>Pasi Jalkanen</b>  <b>Anna Liski</b>  <b>Kenichiro Mizohata</b>	<b>Zsolt Kasztovszkye</b>  <b>Ildikó Harsányie</b>	<b>Raghunath Acharya</b>  <b>Pradeep K. Pujari</b>	<b>Molnár Mihály ,</b>  <b>Mihaly Braun</b>	<b>Amit Haliva</b>  <b>Osnat Israelsohn-Azulay</b>  <b>Zidon Yigal</b>  <b>Hila Rosengarten</b>  <b>Yaron Cohen</b>  <b>Tsach Tsadok</b>

Special thanks to Aliz Simon and Nuno Barradas for the helpful discussions and support

**Thank you!**



# Combining Elemental Analysis and Machine Learning

