

New way to identify ceramics and glasses with tailor-made properties

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Eight Grand Challenges

Workshop on Emerging Research Areas in Ceramic Science

1. Understanding rare events in ceramic microstructures
2. Understanding the phase-like behavior of interfaces
3. Predicting and controlling heterogeneous microstructures with unprecedented functionalities
- 4. Controlling the properties of oxide electronics**
5. Understanding defects in the vicinity of interfaces
6. Controlling ceramics far from equilibrium
- 7. Accelerating the development of new ceramic materials**
8. Harnessing order within disorder in glasses

Background research

Example

Kvashnin A. et al.
New Tungsten Borides, Their Stability and
Outstanding Mechanical Properties
J. Phys. Chem. Lett., **2018**, 9, 3470–3477.

Article submitted 20 April 2018



WB₅:
 $H_V = 45 \text{ GPa}$, $K_{Ic} = 4 \text{ MPa}\cdot\text{m}^{1/2}$

No reference

Ma L. et al.
Preparation and sintering of ultrafine TiB₂ powders.
Ceram. Int. **2018**, 44 (4), 4491–4495.

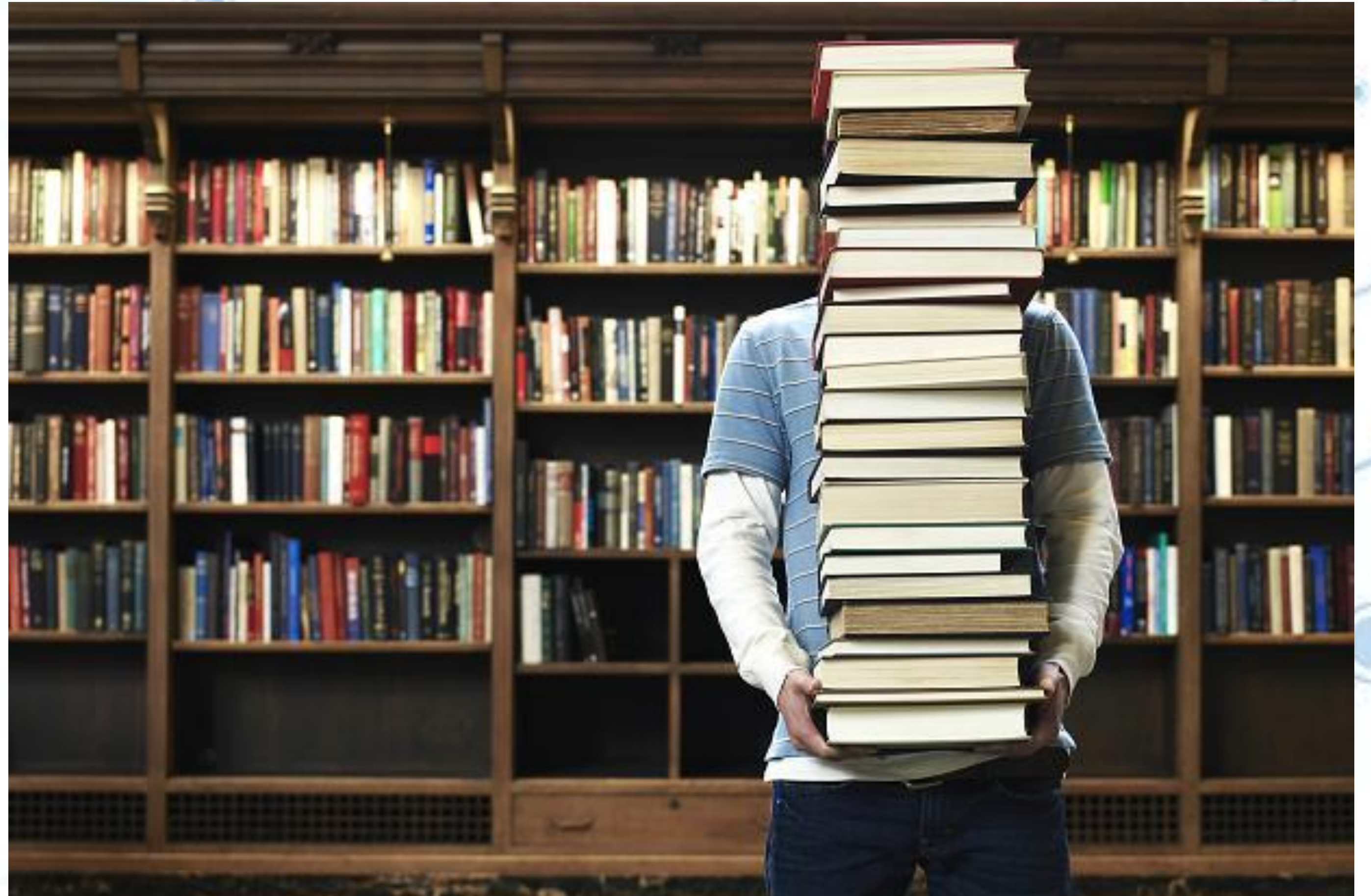
Article available online 5 December 2017

TiB₂ + 5 wt% YAG:
 $H_V = 49.3 \text{ GPa}$, $K_{Ic} = 12.68 \text{ MPa}\cdot\text{m}^{1/2}$

Search by material properties is very hard

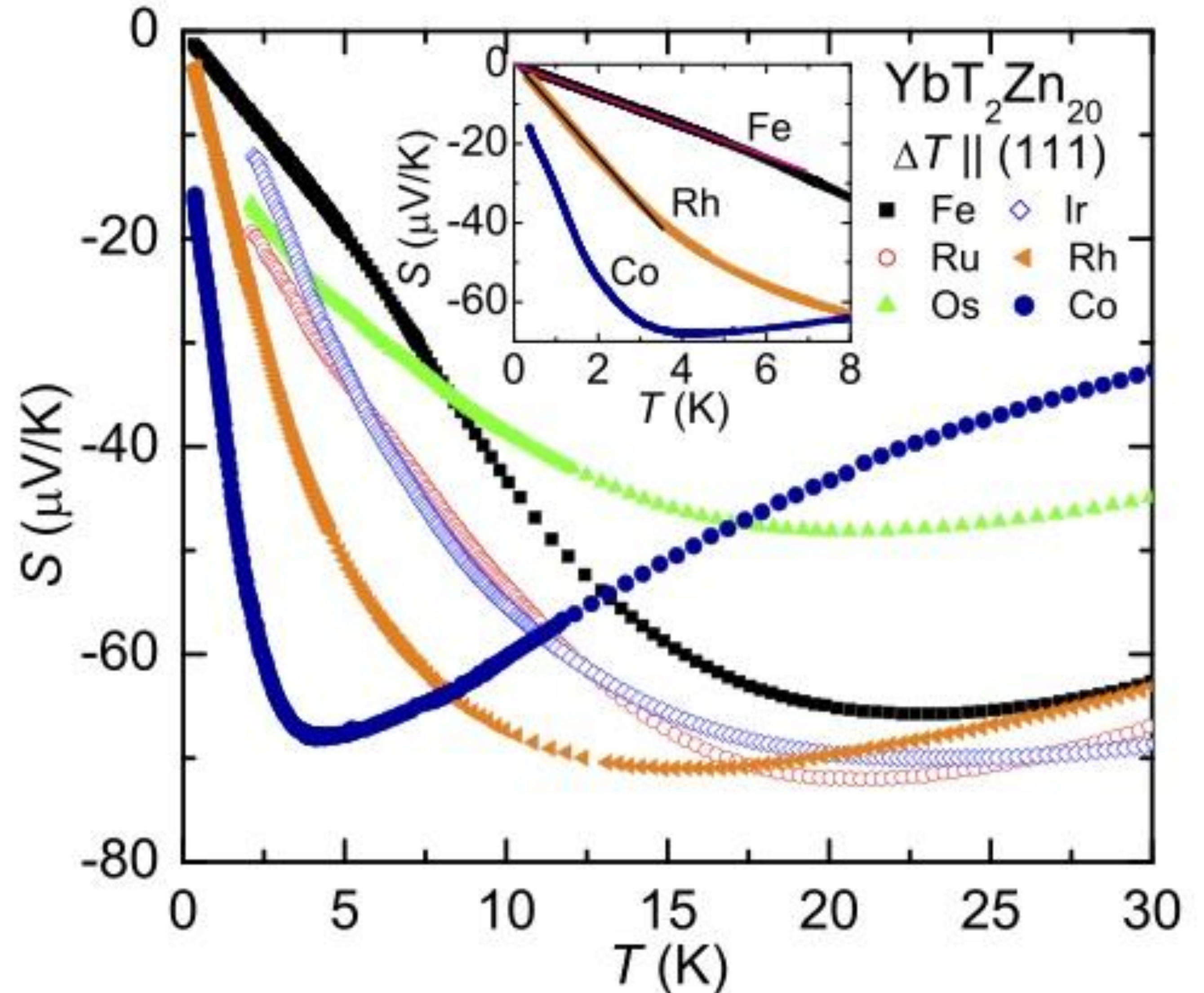
**A lot of handbooks
should be scrutinized
to find the required
materials**

**But we will anyway
miss the newly
synthesized materials**



Search is even harder because of plots

Graphical information is beyond the power of search engines



New hope

Specialized databases

XIX century



Beilstein (1838-1906)
Handbook of organic
compounds

Nowadays

 **REAXYS®**

 **Springer Materials**

 **SCIFINDER®**
A CAS SOLUTION

and more ...



What is **DATA?**

Data is a set of values of qualitative or quantitative variables.

Data is measured, collected and reported, and analyzed, whereupon it can be visualized. Experimental data is data that is generated within the context of a scientific investigation by observation and recording.

Why do we need **THE DATA?**

**THEY ARE USED BOTH IN SCIENTIFIC
RESEARCH AND BUSINESS.**

- **to make decisions**
- **create something new**
- **re-develop existing products**
- **understand the current state of the art**
- **offer enterprise-wide insights**
- **perform risk analysis**



BIG DATA

What is it?

Big data is data sets that are so voluminous and complex that traditional approaches are inadequate to deal with them.

Big data challenges include data mining, data storage, data analysis, search, sharing, transfer, visualization, querying, and updating. There are three dimensions to big data (three “V”) known as Volume, Variety and Velocity.

RAW DATA

Raw data are the source for data mining.

Data mining is a process of cleaning and capturing the data. Problems of raw data: they are unstructured, disordered and complicated. They have a lot of noise (useless data). The bigger the volume of raw data, the harder they are cleaned and mined.



Imagine a really huge supermarket

But the items are highly disordered:

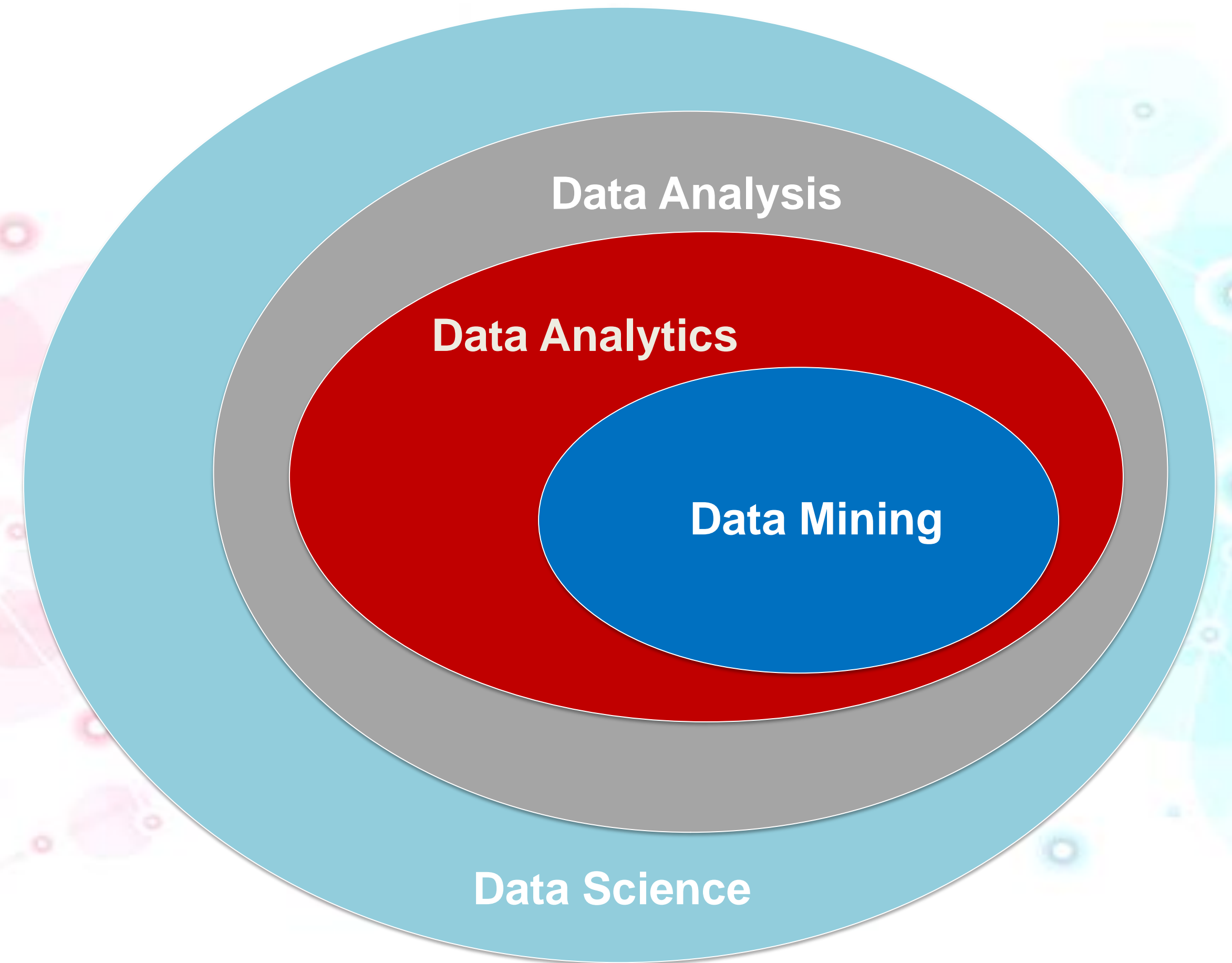
In this case we will miss excellent mangoes. That is a keyword search used by all of us.



How could we overcome keyword search approach?

Using modern data processing approaches.

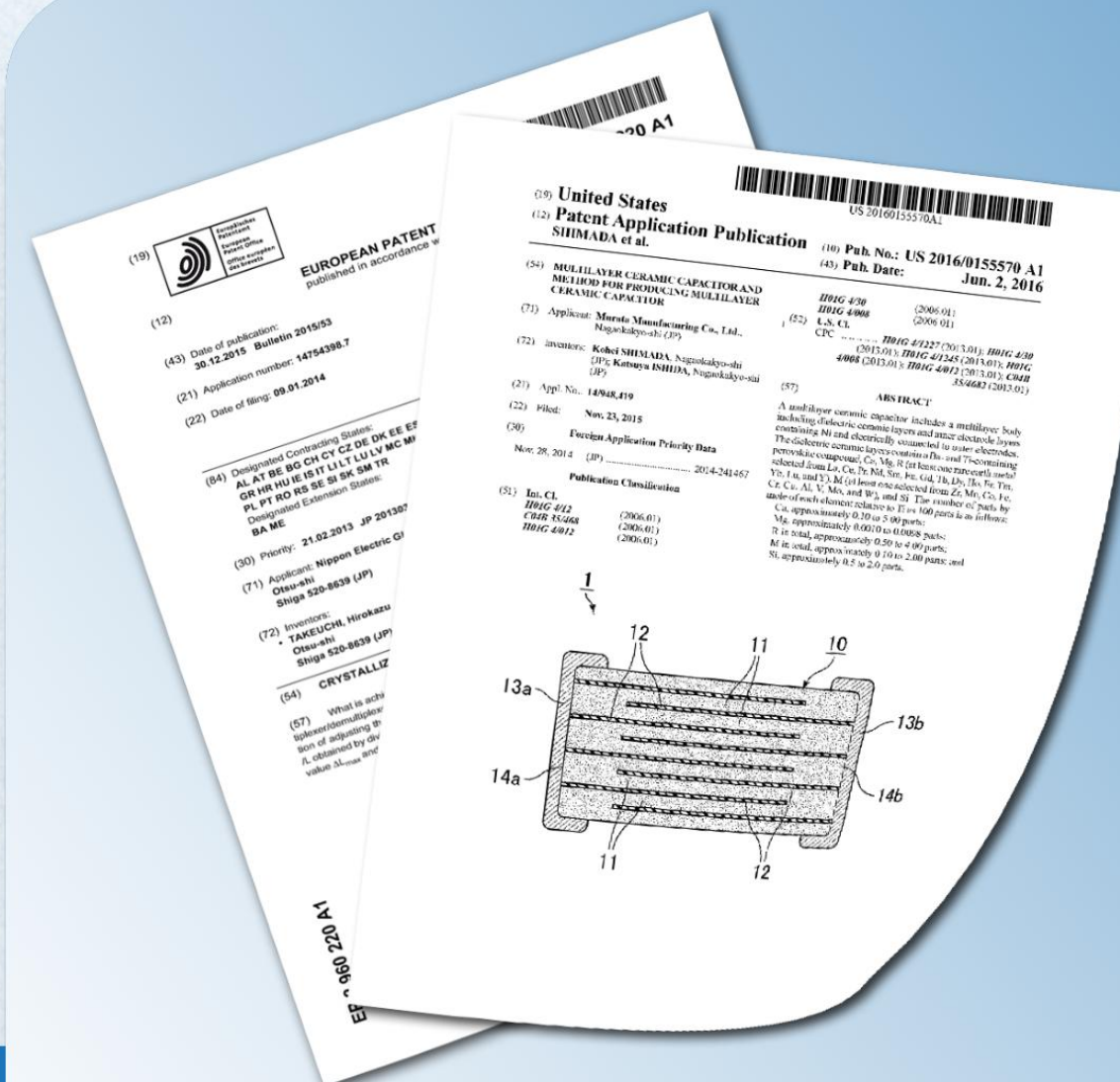
The core of all data techniques and tools is data mining



1. Journal of the European Ceramic Society
2. International Journal of Applied Glass Science
3. Journal of the American Ceramic Society
4. Ceramics International
5. Journal of Non-Crystalline Solids
6. Journal of Electroceramics
7. Journal of Sol-Gel Science and Technology
8. International Journal of Applied Ceramic Technology
9. Advances in Applied Ceramics
10. Acta Materialia
11. Journal of Alloys and Compounds
12. Journal of Solid State Chemistry
13. Materials Letters
14. Chemical Communications
15. Journal of Materials Chemistry A
16. Glass and Ceramics
17. Journal of Advanced Ceramics
18. Journal of Materials Science
19. Vacuum
20. Powder Metallurgy and Metal Ceramics
21. Journal of Solid State Chemistry
22. Journal of the Ceramic Society of Japan
23. Physics and Chemistry of Glasses
24. Journal of the Australian Ceramic Society



Journals



International Patent Classification Codes:

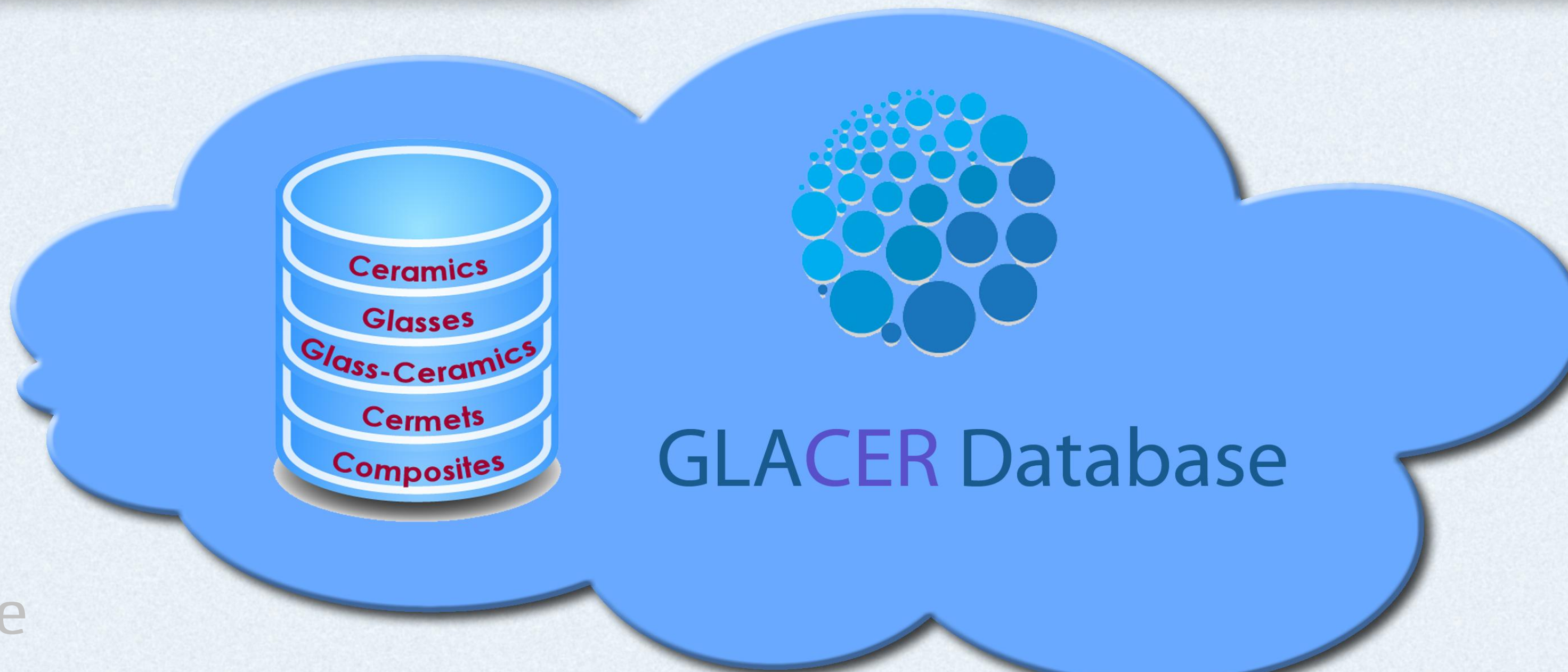
CO3C

CO4B

33
35
38
41/80
41/85-91

Patent Applications

2 million
data
points!



Near 100
types of
numerical
data

The team of Natural Sciences Information Centre has key competence in data mining.

We had mined the experimental data on chemistry, nanotechnology, biotechnology, ...

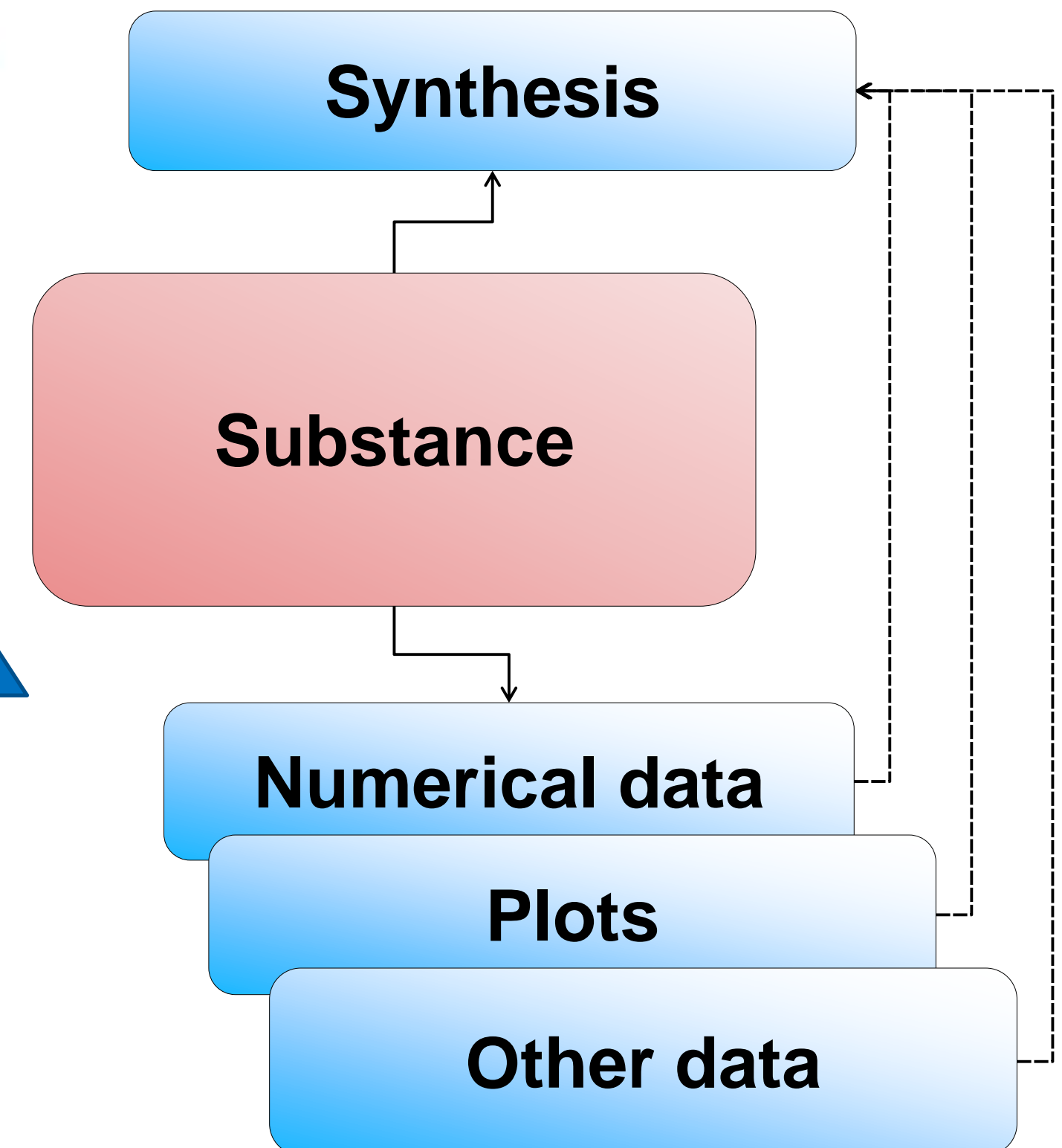
These branches of science now enjoy the structured data ready for analytics.

What about material science?

For many areas of material science the keyword search works not that bad. But not for graphical data in plots.

GlaCer database

Experimental data with preparation links

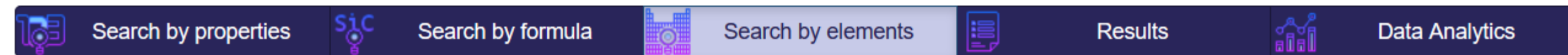


Articles and patents



Easy search for materials

Search by elements



| Group | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 |
|--------|----|----|---|---|---|---|---|---|---|----|----|----|-----|-----|-----|-----|-----|-----|
| Period | 1 | 2 | | | | | | | | | | | | | | | | |
| 1 | H | | | | | | | | | | | | | | | | | He |
| 2 | Li | Be | | | | | | | | | | | B | C | N | O | F | Ne |
| 3 | Na | Mg | | | | | | | | | | | Al | Si | P | S | Cl | Ar |
| 4 | K | Ca | | | | | | | | | | | Ga | Ge | As | Se | Br | Kr |
| 5 | Rb | Sr | | | | | | | | | | | In | Sn | Sb | Te | I | Xe |
| 6 | Cs | Ba | | | | | | | | | | | Tl | Pb | Bi | Po | At | Rn |
| 7 | Fr | Ra | | | | | | | | | | | Uut | Uuq | Uup | Uuh | Uus | Uuo |

| | | | | | | | | | | | | | | |
|--------------|----|----|----|----|----|----|----|----|----|----|----|-----|-----|-----|
| *Lanthanoids | 57 | 58 | 59 | 60 | 61 | 62 | 63 | 64 | 65 | 66 | 67 | 68 | 69 | 70 |
| | La | Ce | Pr | Nd | Pm | Sm | Eu | Gd | Tb | Dy | Ho | Er | Tm | Yb |
| **Actinoids | 89 | 90 | 91 | 92 | 93 | 94 | 95 | 96 | 97 | 98 | 99 | 100 | 101 | 102 |
| | Ac | Th | Pa | U | Np | Pu | Am | Cm | Bk | Cf | Es | Fm | Md | No |

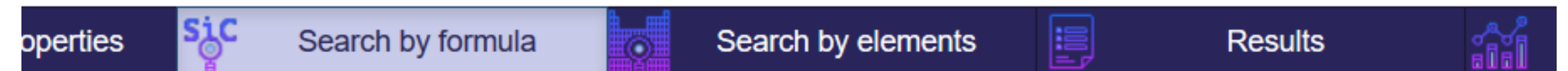
clear selection

Search by selected elements (1504)

Search by element system

[Li-B-O-Na-Mg-Al-Si-P-S-Ca-Cr-Mn-Fe-Ni-Zn-Sr-Zr-Sn-Ba-La-Ce-Pb](#) (1)
[Li-B-O-Na-Mg-Al-Si-P-S-Ca-Cr-Mn-Fe-Ni-Zn-Sr-Zr-Sn-Ba-La-Ce-Pb-Bi](#) (1)
[Li-B-O-Na-Mg-Al-Si-S-K-Ca-Sc-Ti-Fe-Y-Zr-La-Nd](#) (1)
[Li-B-O-Na-Mg-Al-Si-K-Ti-Zn-Zr-Nb-Sn-Sb-La](#) (1)
[Li-B-O-Na-Mg-Al-Si-K-Ti-Zn-Zr-Nb-Sn-La](#) (8)
[Li-B-O-Na-Mg-Al-Si-K-Ti-Zn-Zr-Nb-Sn-La-Ce](#) (384)
[Li-B-O-Na-Mg-Al-Si-K-Ti-Zn-Zr-Nb-Sb-La](#) (1)
[Li-B-O-Na-Mg-Al-Si-K-Ti-Zn-Zr-Nb-La-Ce](#) (1)
[Li-B-O-Na-Al-Si-P-Ca-Cr-Fe-Ni-Zn-Sr-Y-Zr-Mo-Ag-Cd-Sn-Te-Cs-Ba-La-Pr-Nd](#) (1)
[Li-B-O-Na-Al-Si-K-Ca-Mn-Fe-Co-Ni-Zn-Zr-Mo-Ag-Te-Cs-Ba-La-Ce-Pr-Nd-Sm-Gd](#) (1)
[Li-B-O-Na-Al-Si-K-Ca-Mn-Fe-Co-Ni-Zn-Zr-Ba-La-Ce-Pr-C](#) (1)
[Li-B-O-Na-Al-Si-K-Ti-Zr-Sn-La-Ce](#) (338)
[Li-B-O-Na-Si-K-Ca-Ti-Zn-Zr-Nb-Ba-La](#) (2)
[Li-B-O-Na-Si-K-Ti-Zn-Zr-Nb-Ba-La](#) (1)
[Li-B-O-Na-Si-K-Ti-Y-Zr-Nb-Sb-La](#) (1)
[Li-B-O-Mg-Al-Si-Ca-Zr-La](#) (1)
[Li-B-O-Al-Si-Ca-Zr-Nb-Ba-La](#) (3)
[Li-B-O-Al-Si-Ca-Zr-Nb-La](#) (3)
[Li-B-O-Al-Si-Ca-Zr-La](#) (7)
[Li-B-O-Si-P-Ti-Zn-Zr-Sb-La-Cd](#) (4)

Search by formula



Si

Si0.0277(AlCrMoTaTi)0.9723N

Si0.042Y3Al4.958O12

Si0.0751(AlCrMoTaTi)0.9249N

Si0.19P0.12O0.69

Si0.26P0.063O0.67

Si0.29P0.036O0.67

Si0.29P0.039O0.67

Si0.22P0.002O0.66

Search

Search for required materials

Search by any combination of desired properties



+ Add property

Young's modulus, E –

Select property...

- Abbe number, V_D
- annealing point
- Berkovich hardness, H_{BK}**
- Brinell hardness, H_B
- carrier concentration, n_i
- compressive strength, σ
- Curie-Weiss temperature, T_{CW}
- Curie constant, C

**Near hundred types
of numerical data**

- ✓ Density
- ✓ Curie temperature
- ✓ Transmittance
- ✓ Conductivity
- ✓ Piezo coefficients
- ✓ Permittivity
- ✓ Young's modulus
- ✓ Vickers hardness
- ✓ Flexural strength
- ✓ Loss tangent
- ✓ Thermal conductivity
- ✓ Dielectric strength
- ✓ Fracture toughness
- ✓ Compressive strength
- ✓ Wear coefficient
- ✓ Coercivity
- ✓ Remanence
- ✓ Poisson's ratio

Graphical data plots

Original plot

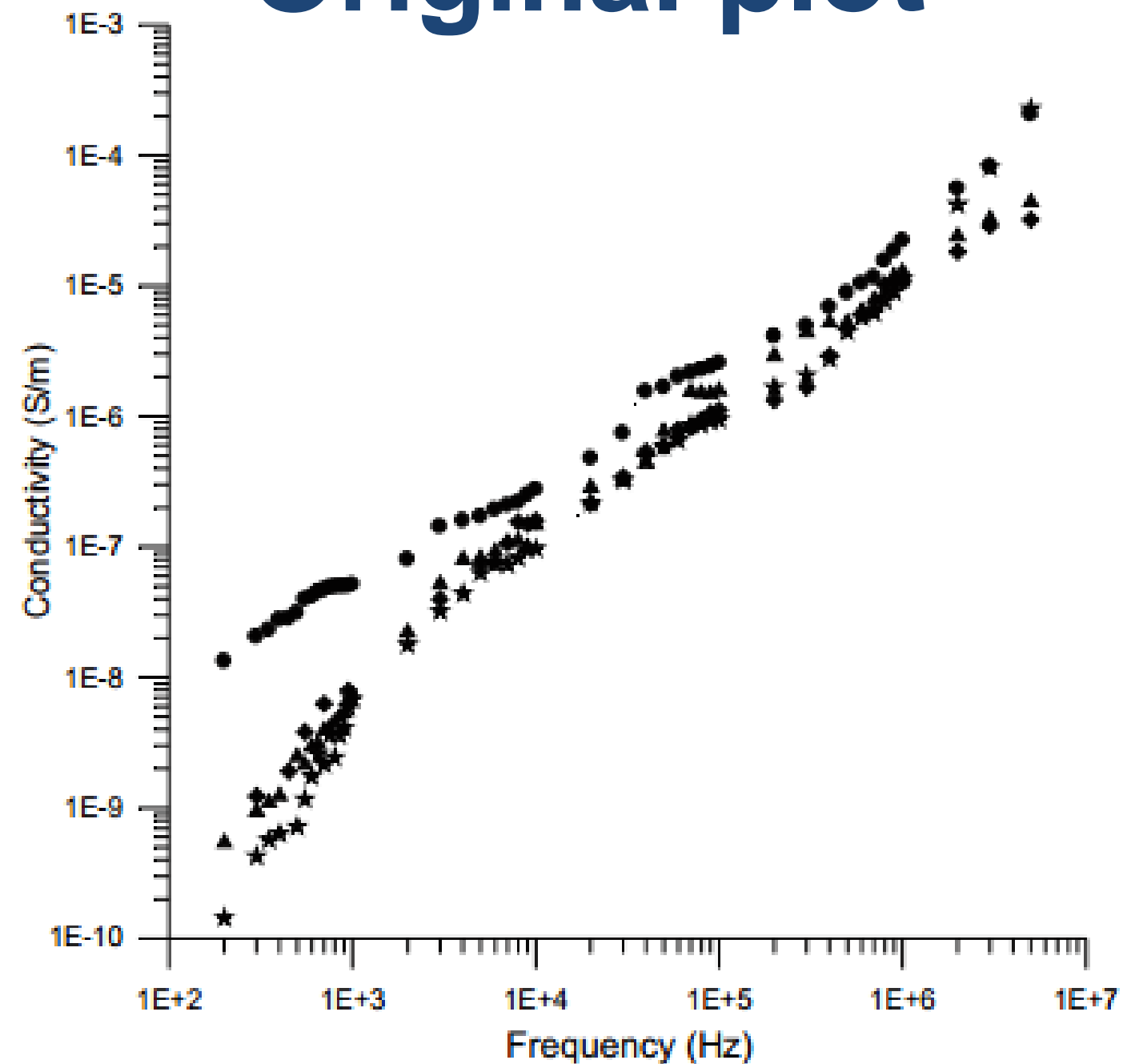
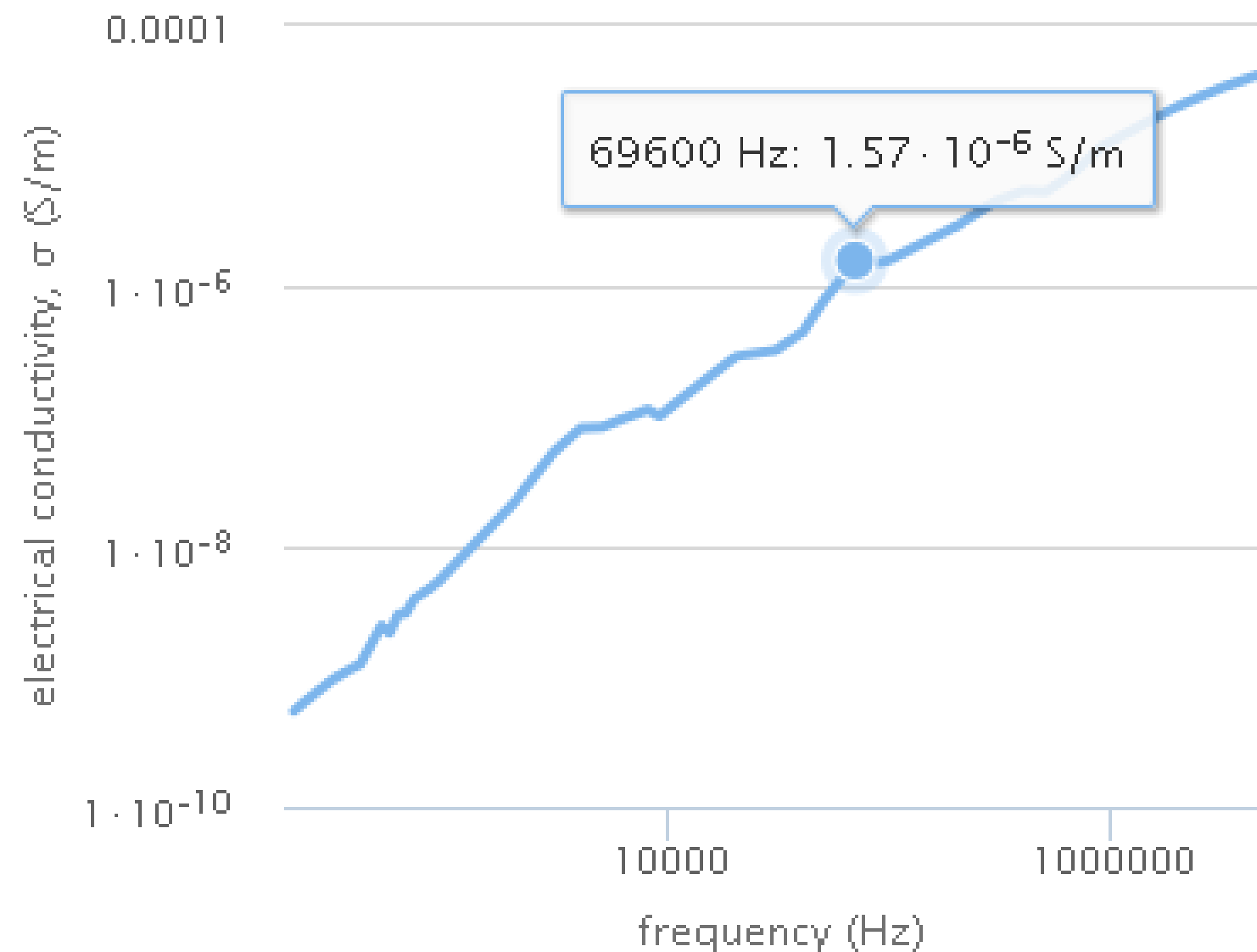


Fig. 5 Conductivity variation with frequency for samples G₁ (◆), G₂ (●), G₃ (▲) and G₄ (★).

Taken from
Ibrahim, S., Gomaa, M.M. & Darwish, H.
J Adv Ceram (2014) 3: 155

Values are searchable in
database!

digitized interactive plot



Even derived data are accessible by search

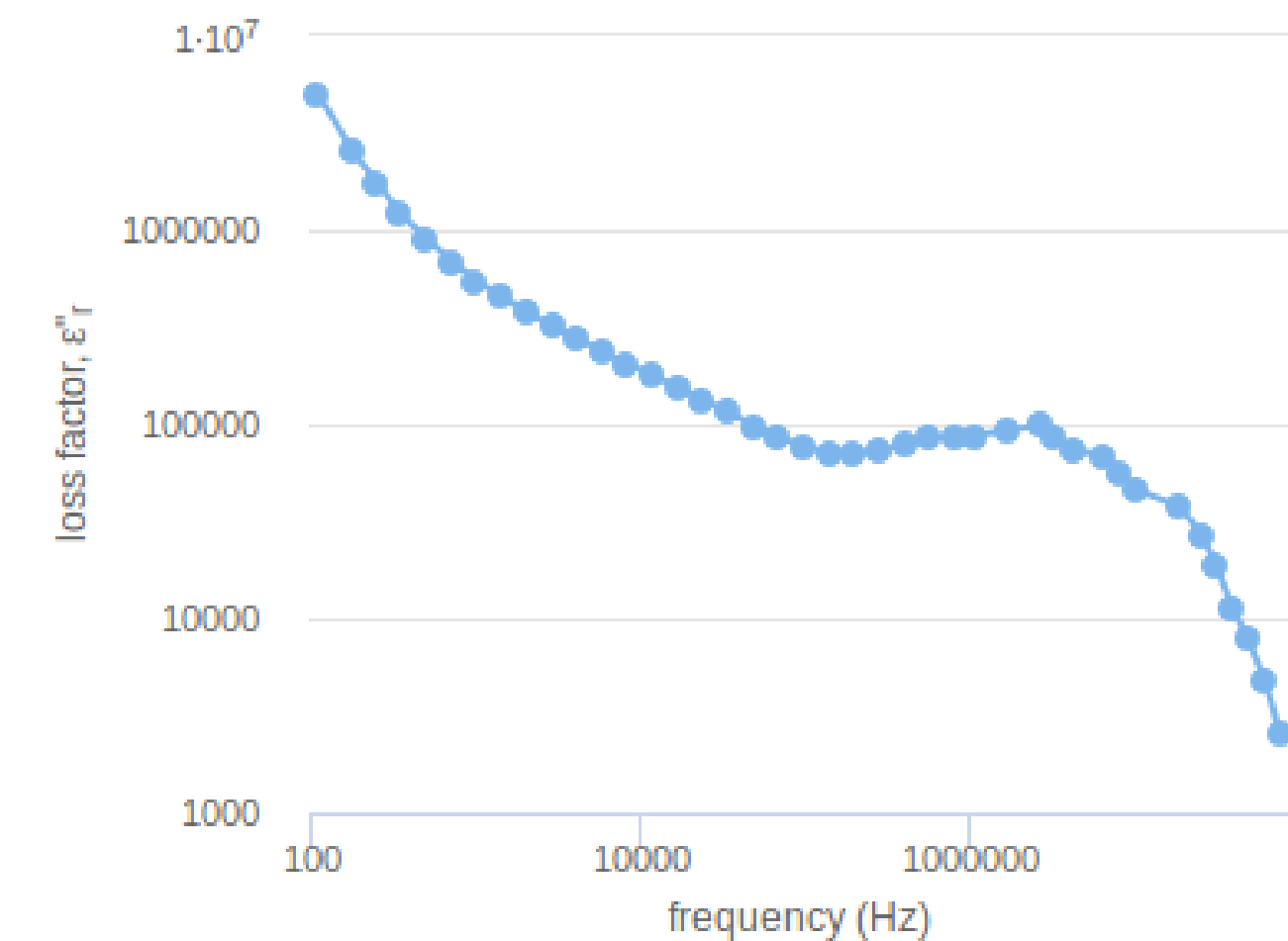
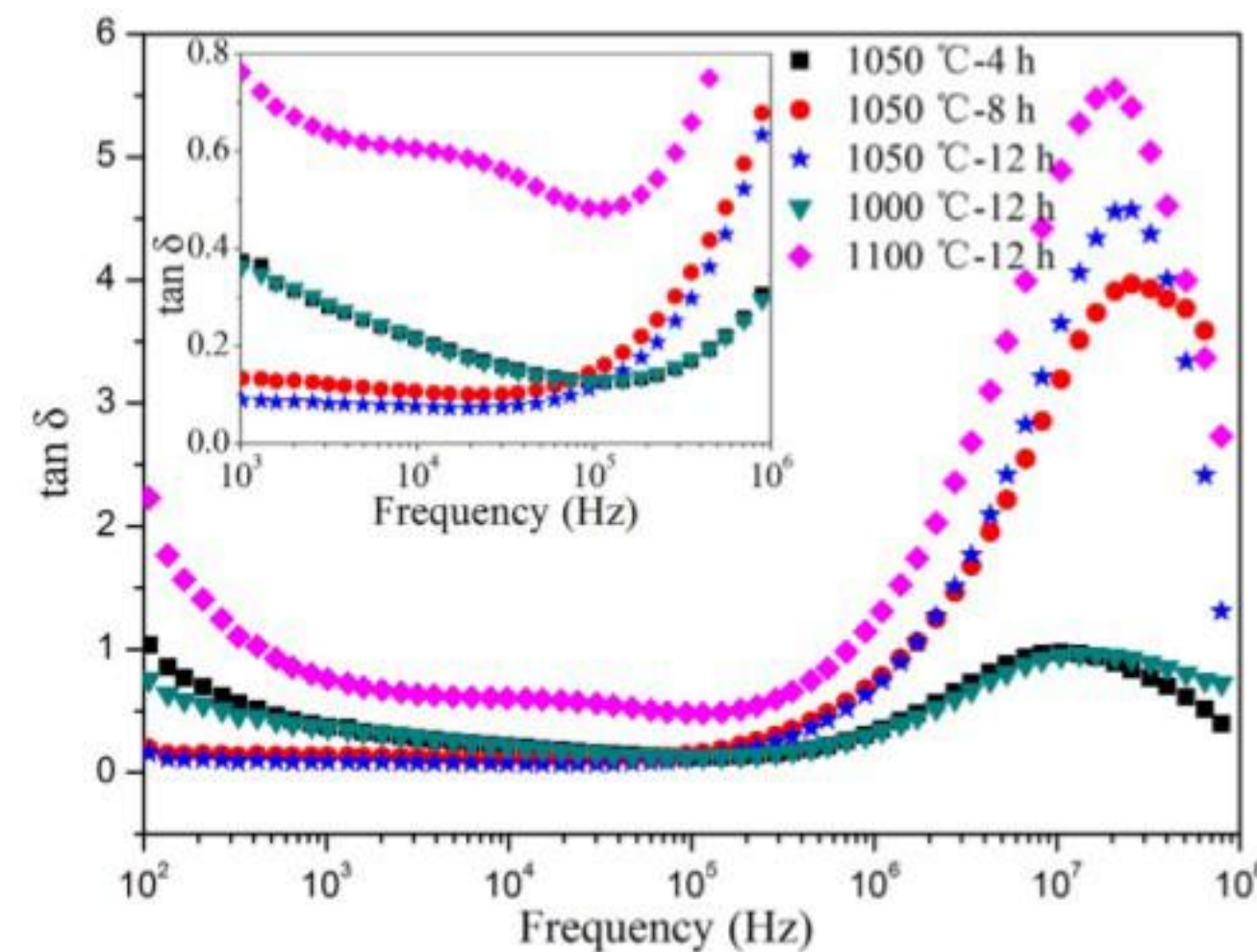
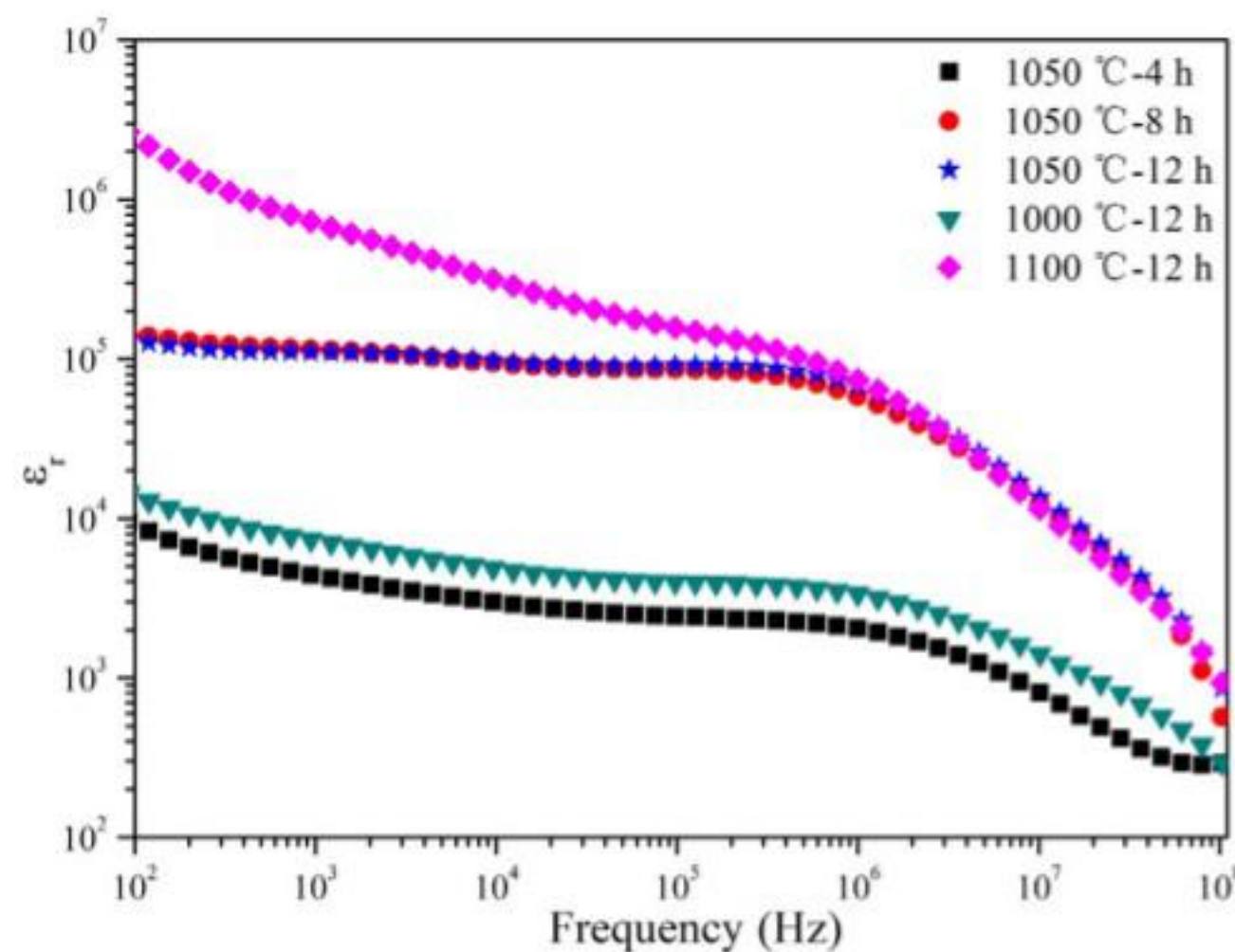
Example of derived data

Abstracted:

- Permittivity ϵ'
- Loss tangent $\tan \delta$

Auto

Converted to:
Loss factor ϵ''
($\epsilon'' = \epsilon' * \tan \delta$)



Derived numerical data

Definitions and laws of physics

TABLE 1

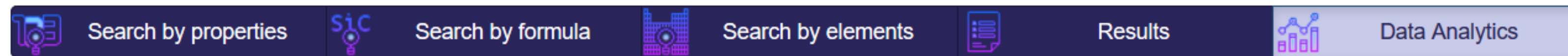
| Exemplary Clad Glass Compositions | | | | | | | |
|-----------------------------------|--------|--------|-------|--------|--------|--------|--------|
| | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| SiO ₂ | 30 | 25 | | 8.3 | 8 | 7.72 | 7.46 |
| Al ₂ O ₃ | 15 | 15 | 34.6 | 33 | 31.79 | 30.67 | 29.62 |
| B ₂ O ₃ | | | | | | | |
| MgO | 5 | 5 | 3.8 | | 3.66 | 3.53 | 3.41 |
| CaO | | | 61.6 | 58.7 | 56.55 | 54.55 | 52.69 |
| SrO | | | | | | 3.53 | 3.41 |
| ZnO | 5 | 5 | | | | | 3.41 |
| La ₂ O ₃ | 10 | 15 | | | | | |
| Ta ₂ O ₅ | 30 | 30 | | | | | |
| Y ₂ O ₃ | 5 | 5 | | | | | |
| ZrO ₂ | | | | | | | |
| Li ₂ O | | | | | | | |
| TiO ₂ | | | | | | | |
| Shear Modulus (GPa) | 53.77 | 53.88 | 42.93 | 41.32 | 41.9 | 41.91 | 42.16 |
| Young's Modulus (GPa) | 141.62 | 142.42 | 109.7 | 105.68 | 107.39 | 107.06 | 108.07 |
| Annealing Point (C.) | | | | | 814.5 | 807 | 783.5 |
| Strain Point (C.) | | | | | 780.7 | 772.1 | 747.9 |
| Softening Point (C.) | 938.5 | | | | 947.5 | 942.6 | 924.2 |

$$E=2 \cdot G \cdot (1+\nu)$$

| Glass | Poisson's Ratio |
|-------|-----------------|
| 1 | 0,32 |
| 2 | 0,32 |
| 3 | 0,28 |
| 4 | 0,28 |
| 5 | 0,28 |
| 6 | 0,28 |
| 7 | 0,28 |

Data analytics

Useful correlations and statistics for search results



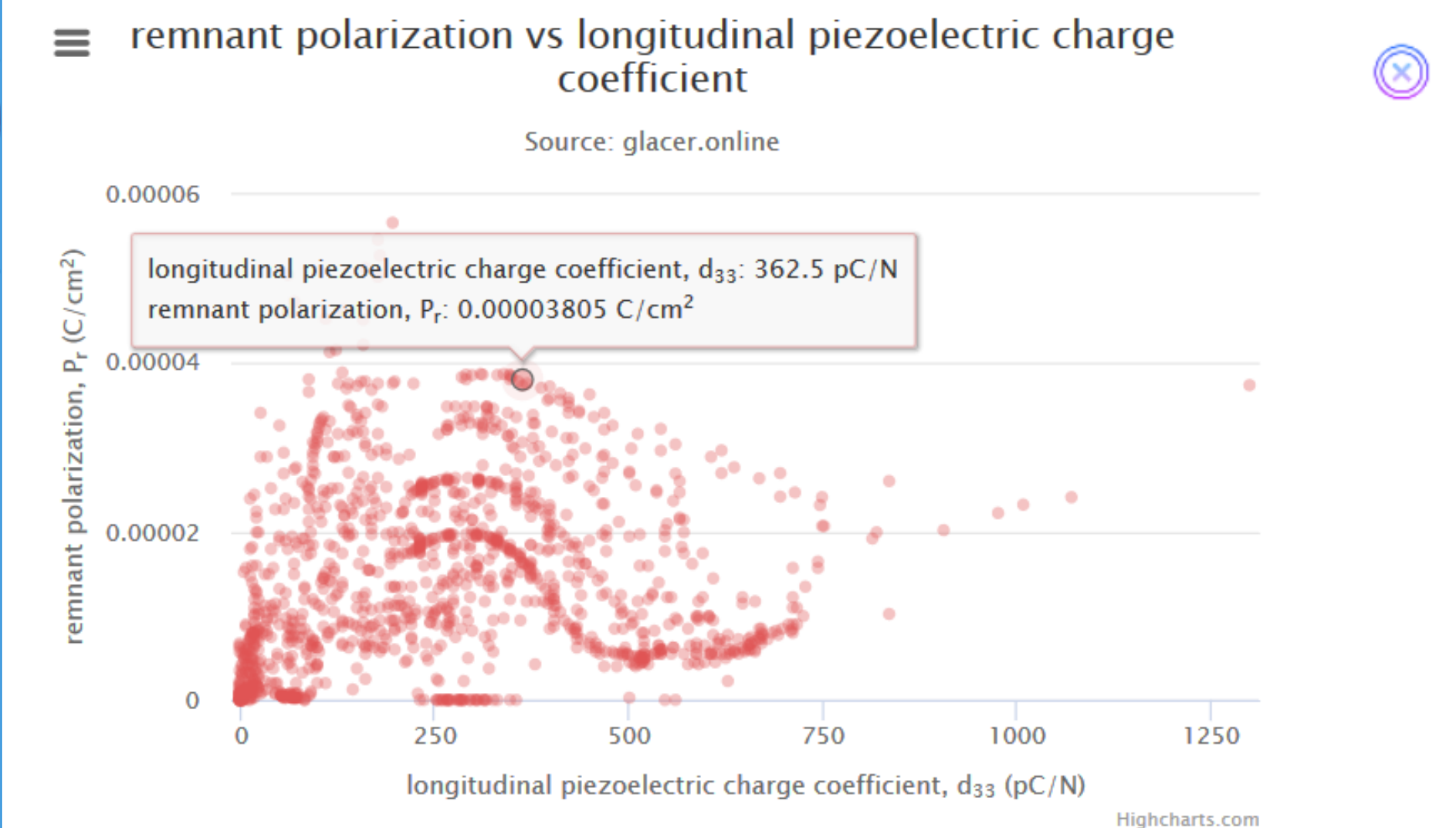
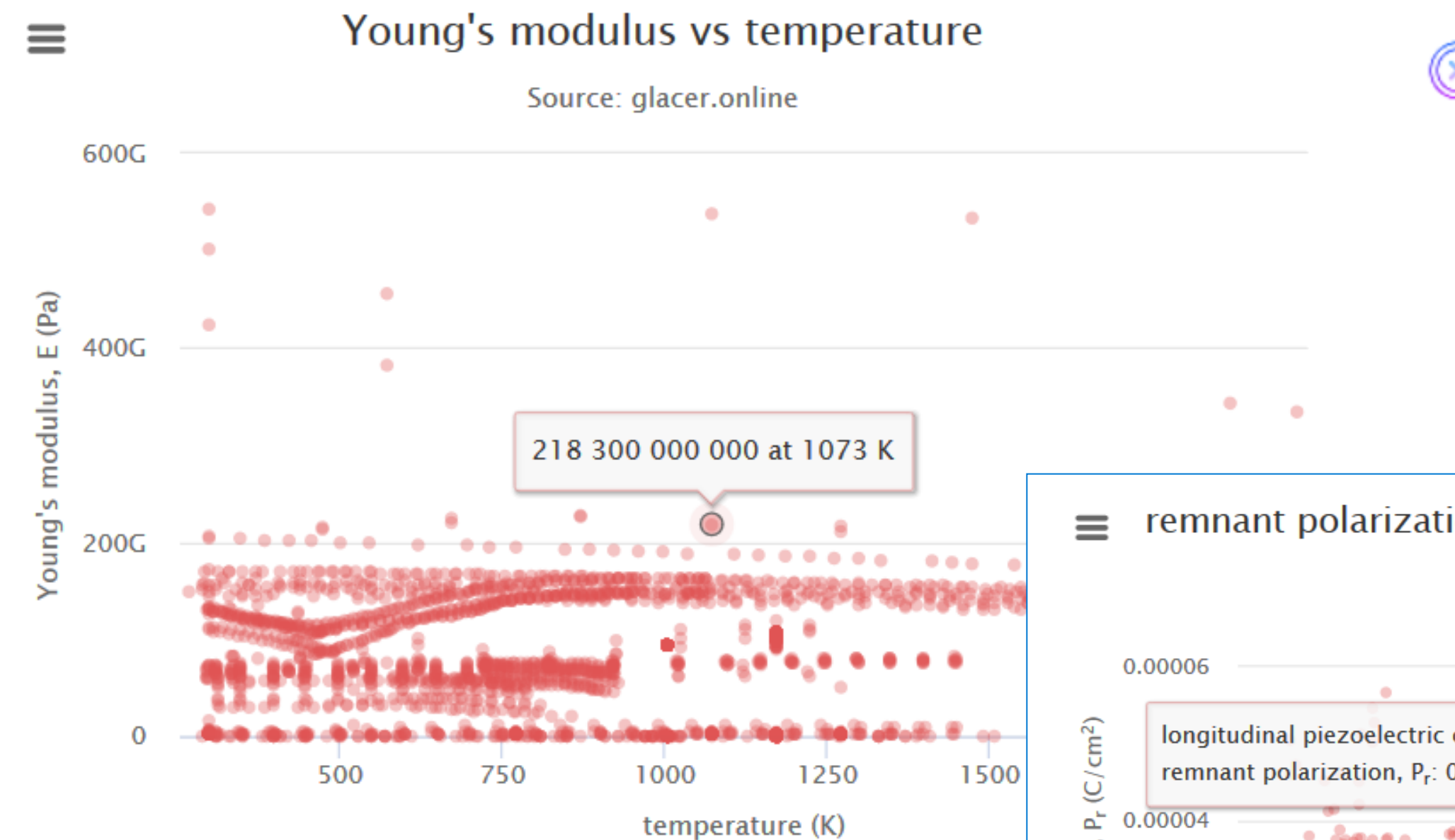
Boxplot

Correlation

Temperature distribution

Parameter vs atom content

Wordcloud



Search example

Transparent conductive films

- High transmittance ($>80\%$)
- High electrical conductivity ($>1000 \text{ S/cm}$)
- Solar panels
- Touch screens
- Smart windows

Search example

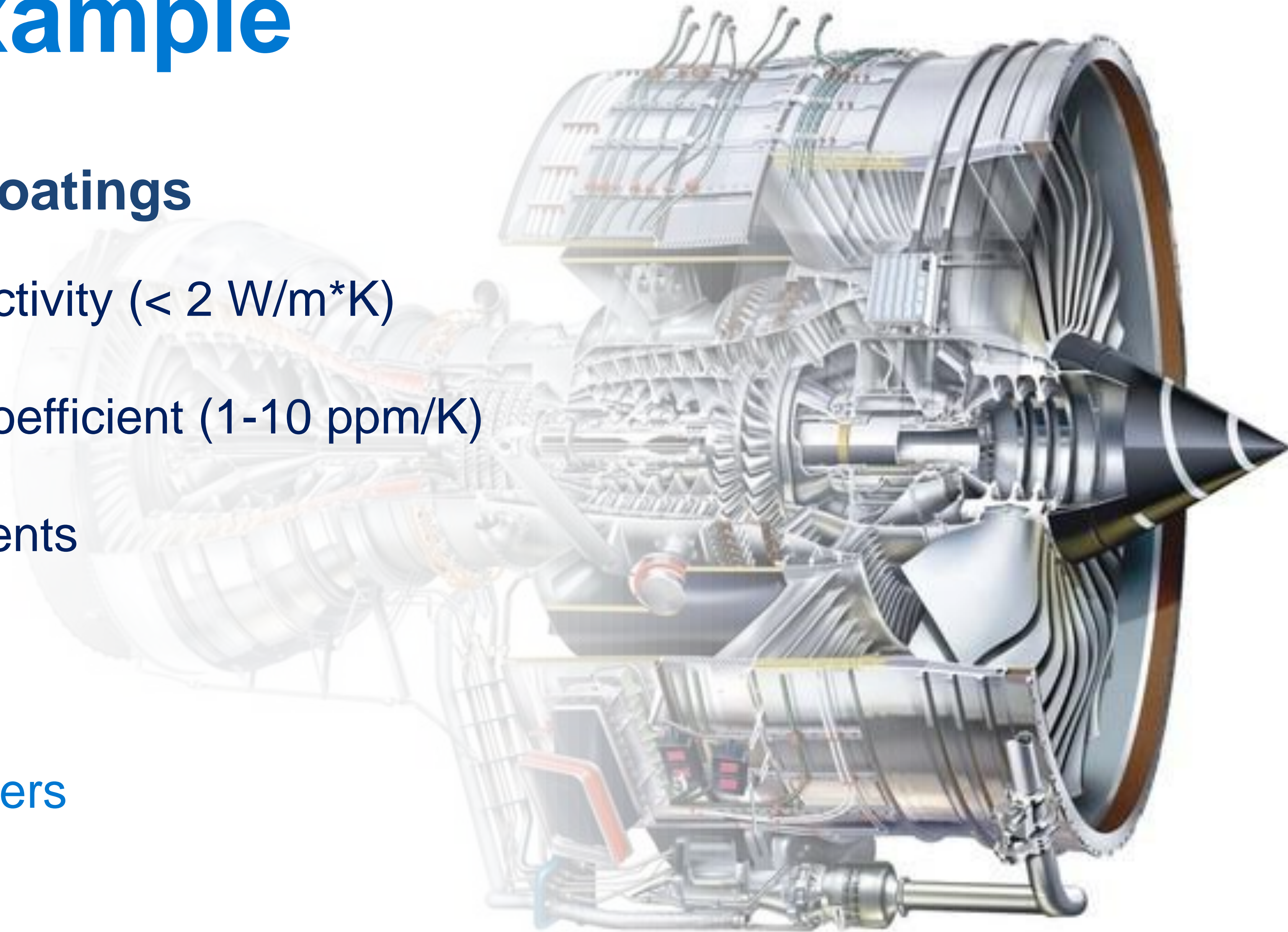
Telecommunication materials

- High relative permittivity ($> 10\,000$)
- At $t = 80\text{-}100\text{ }^{\circ}\text{C}$
- In narrow frequency region (4.8-4.9 MHz)

Search example

Thermal barrier coatings

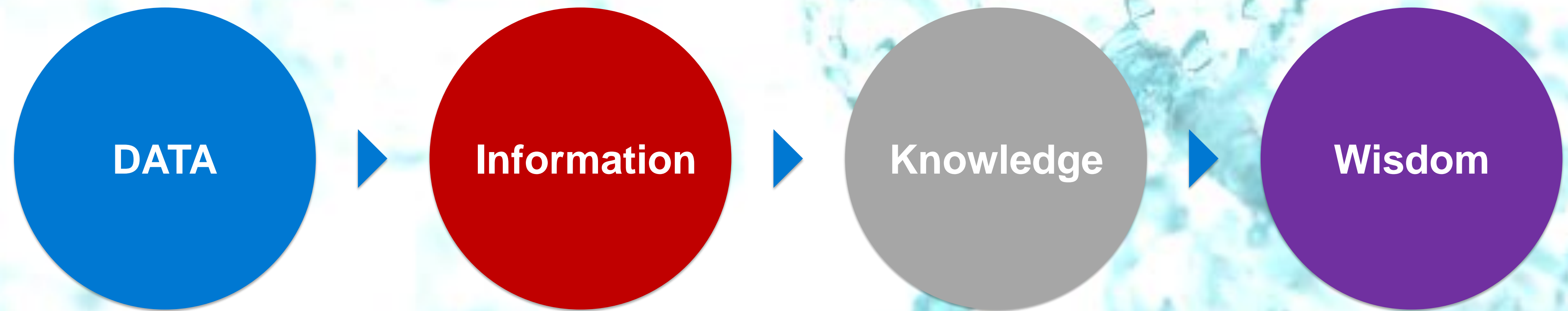
- Low thermal conductivity ($< 2 \text{ W/m}^{\circ}\text{K}$)
- Linear expansion coefficient (1-10 ppm/K)
- No rare earth elements
- Turbine blades
- Combustion chambers



Extreme properties

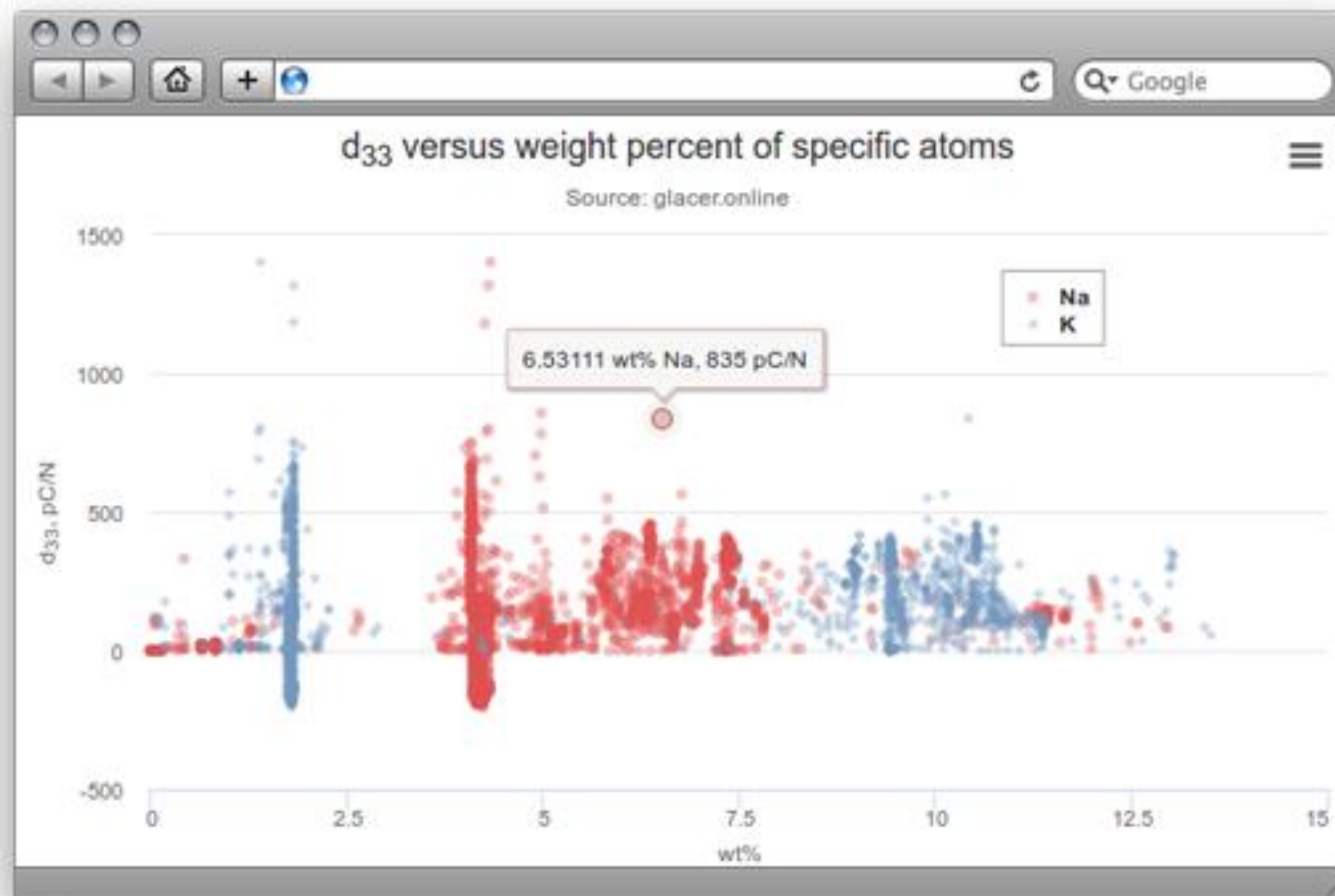
Wonderful materials

- Fe:BN core-shell metamaterial: $\epsilon'_r = -100\,000$ at 23 MHz
- Nanofibrous YSZ: $E = 0.016$ GPa
- $\text{TiB}_2 + 2.5 \text{ wt\% EuB}_6$: $E = 659$ GPa
- Foam-like hexagonal boron nitride: $\rho = 0.0017 \text{ g/cm}^3$
- $\text{Mn}_3\text{Cu}_{0.9}\text{Si}_{0.1}\text{N}$: $\text{CTE} = -6.3 \cdot 10^{-6} \text{ }^\circ\text{C}^{-1}$



THANK YOU!

Navigate to  **glacer.online**
to discover:



| Property | Value | Parameters | Details | Preparation reference | Citation |
|-------------------------------------|--------------------------------|-------------------|--------------|-----------------------|--|
| dielectric strength, E _b | 14 kV/mm | | | | Ootomo, M. et al. (2015) |
| dielectric strength, E _b | 35.9 kV/mm | thickness 1 mm | rectified AC | preparation 4 | Neusel, C. et al. (2015) |
| dielectric strength, E _b | 83.2 kV/mm | thickness 0.36 mm | DC | preparation 4 | Neusel, C. et al. (2015) |
| dielectric strength, E _b | 55.6 kV/mm | thickness 1.03 mm | DC | preparation 4 | Neusel, C. et al. (2015) |
| electrical resistivity, ρ | 2.45 · 10 ¹⁵ Ω · cm | | | | Su, G.-Q. et al. (2014) |
| flexural strength, σ | 325 MPa | | | preparation 9 | Li, D. et al. (2016) |
| flexural strength, σ | 350 MPa | | | | Schneider, J. et al. (2016) |
| flexural strength, σ | 477 MPa | | | preparation 4 | Neusel, C. et al. (2015) |
| fracture toughness, K _{IC} | 3.7 MPa · m ^{1/2} | | | | Schneider, J. et al. (2016) |
| fracture toughness, K _{IC} | 2.7 MPa · m ^{1/2} | load 20 N | | preparation 7 | Fedosova, N.A. et al. (2015) |