

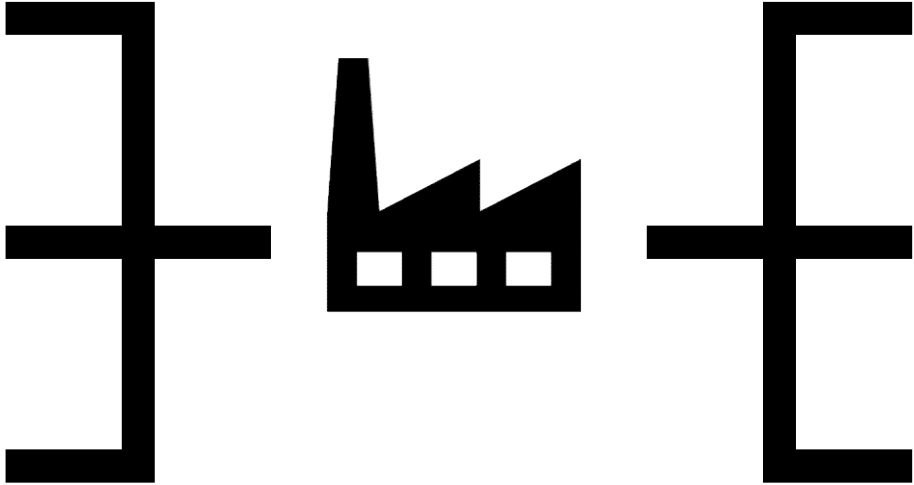
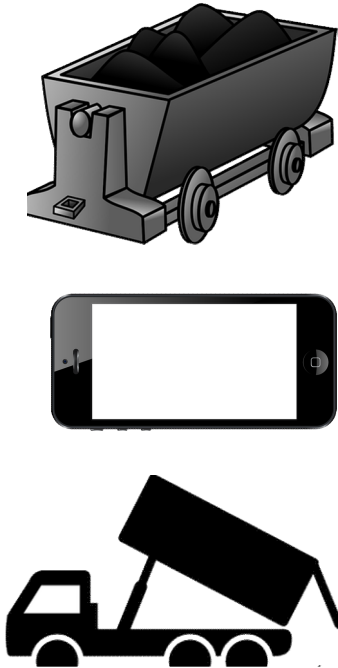
# The aiMP database

**M. to Baben<sup>1</sup>, F. Tang<sup>1</sup>, C. Aras<sup>1</sup>, C. Kattuputhur<sup>1</sup>,  
K. Hack<sup>1</sup>**

<sup>1</sup> GTT-Technologies



# What is metallurgy about?



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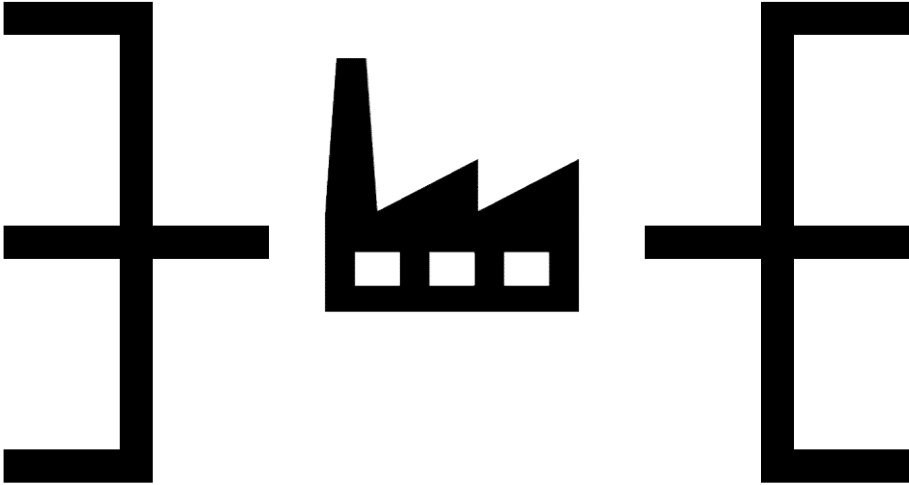


# What is metallurgy about?

H																	He
Li	Be											B	C	N	O	F	Ne
Na	Mg											Al	Si	P	S	Cl	Ar
K	Ca	Sc	Ti	V	Cr	Mn	Fe	Co	Ni	Cu	Zn	Ga	Ge	As	Se	Br	Kr
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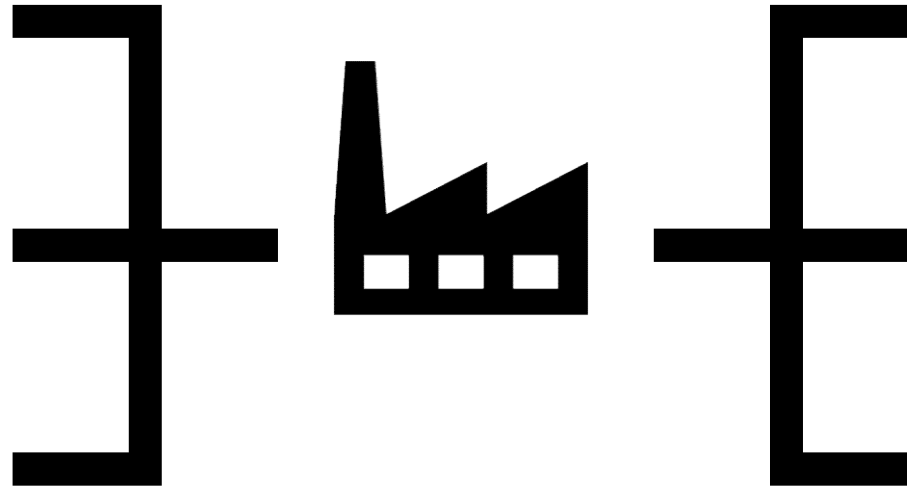
# What is metallurgy about?

## Navigation in chemical compound space!

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# What is metallurgy about?

## Navigation in chemical compound space!

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		La	Ce	Pr	Nd	Pm	Sm	Eu	Gd	Tb	Dy	Ho	Er	Tm	Yb	Lu			
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Image from NASA (Hubble telescope)



# What is metallurgy about?

## Navigation in chemical compound space!

Image from NASA (Hubble telescope)



# What is metallurgy about?

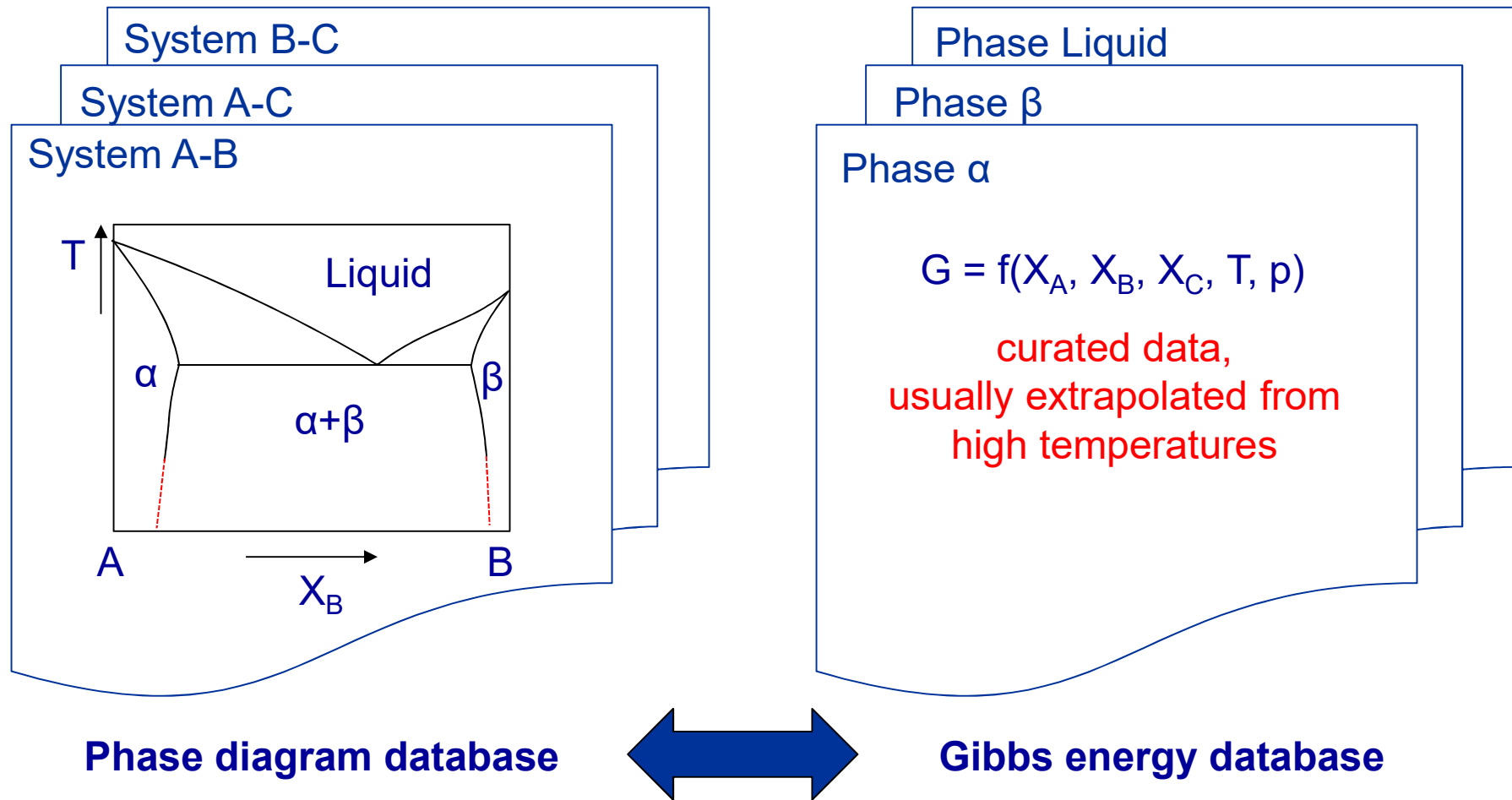
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Image from NASA (Hubble telescope)



# What is the CalPhaD (Calculation of Phase Diagrams) method?





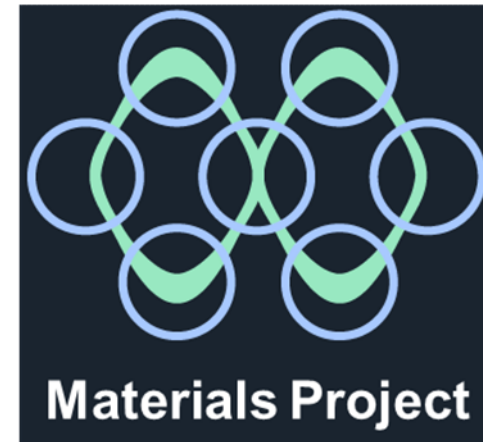
# Thermodynamic data

- Large updates in FactSage7.3:  
Copper and Lead databases are ~doubled in scope
- Largest databases available:  
FactPS: 6912 compounds  
SGTE Solutions: 319 solutions, 1166 compounds



# Thermodynamic data

- aiMP2.3 (ab initio materialsproject.org):
  - 120'539 compounds (was 67'000 in aiMP1.0, end of 2017)
  - $\Delta H_f^{0K}$  from materialsproject.org
  - semi-empirical corrections for  $\Delta H_f^{298K}$
  - empirical models for  $C_p$
  - machine learning for  $S^{298K}$
  - Ideal FCC and BCC solution phases



# Why aiMP?

## Navigation in chemical compound space!

Content of FSlead database

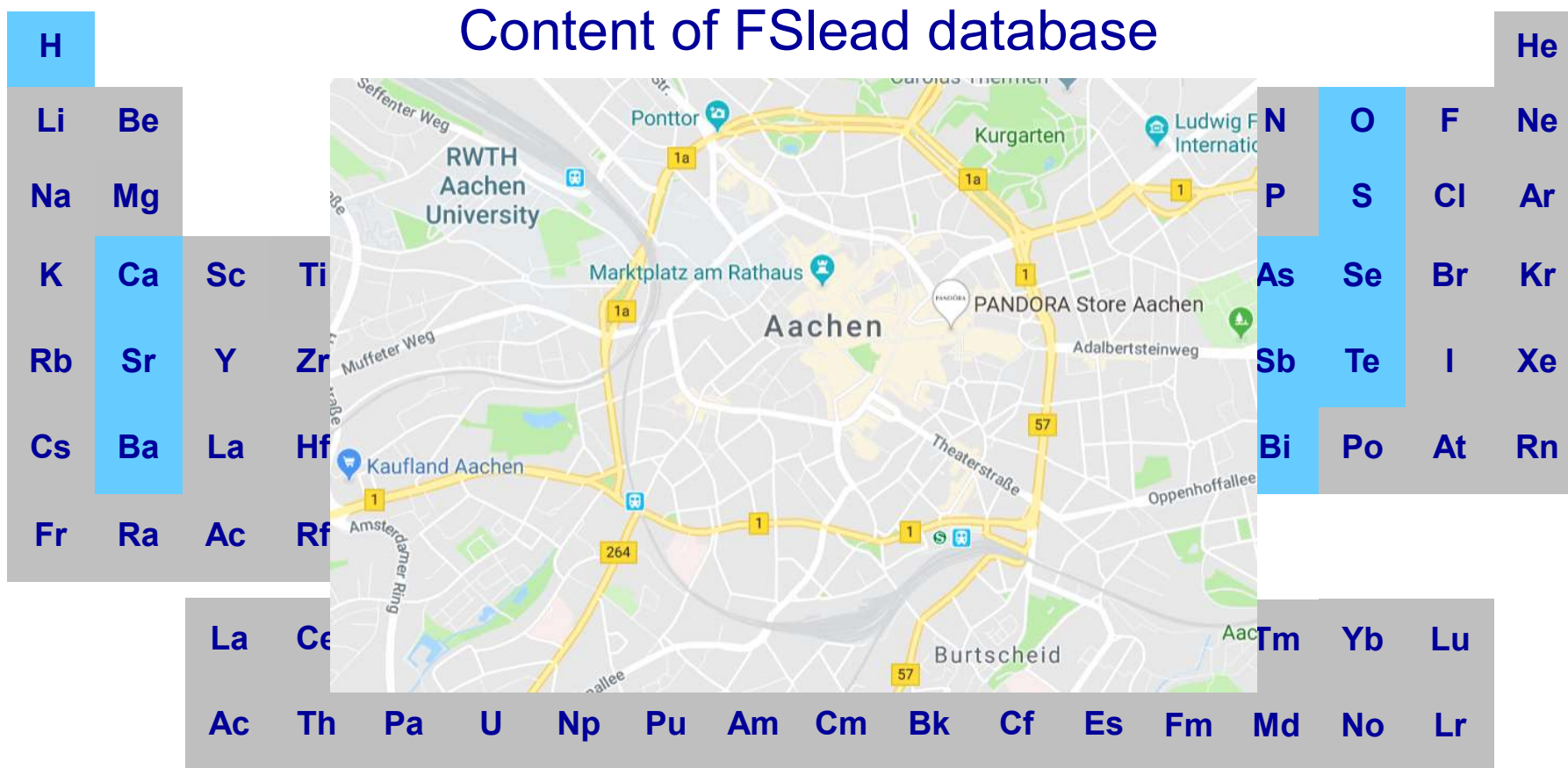
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# Why aiMP?

## Navigation in chemical compound space!

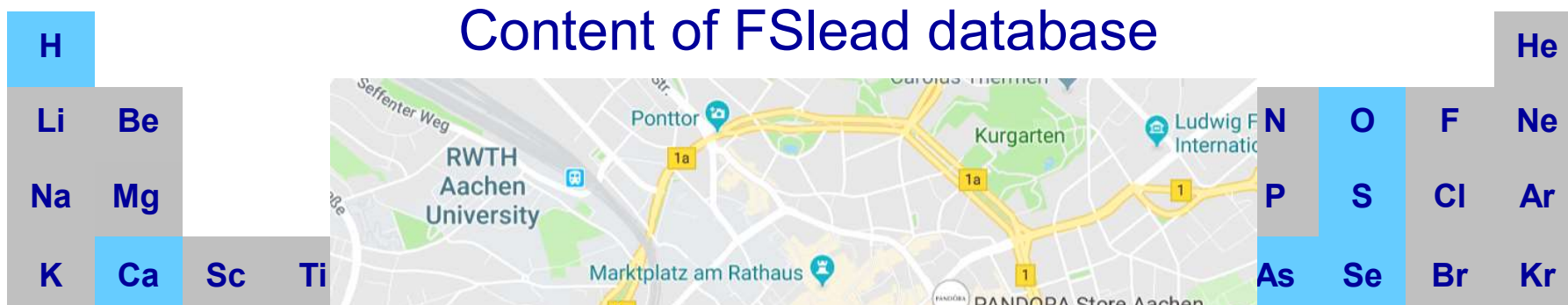
### Content of FSlead database



# Why aiMP?

## Navigation in chemical compound space!

Content of FSlead database



**Excellent to get around in Aachen, but useless if you want to go to Cologne...**



# Why aiMP?

## Navigation in chemical compound space!

### Content of aiMP database

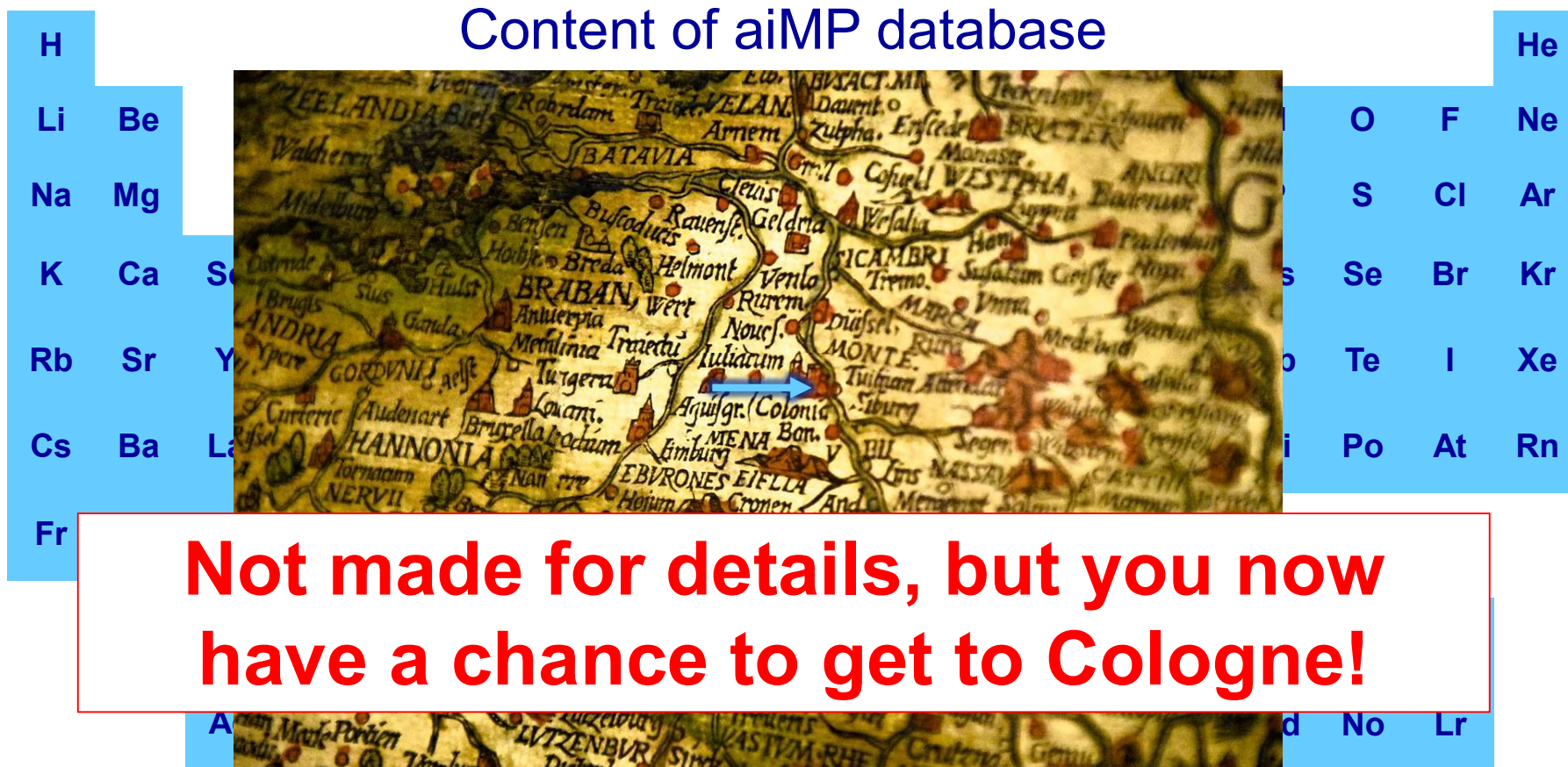
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# Why aiMP?

## Navigation in chemical compound space!

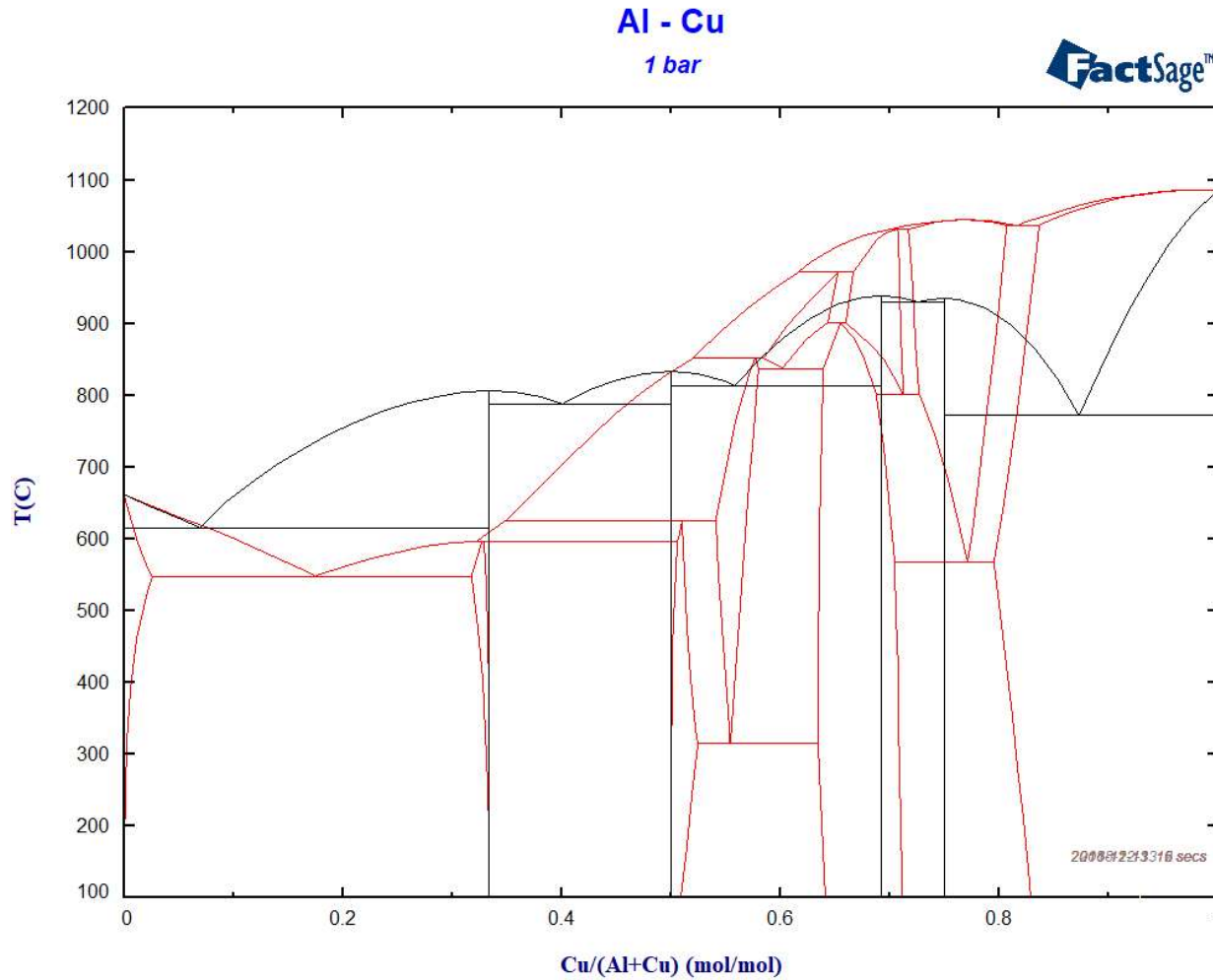
Content of aiMP database



**Not made for details, but you now have a chance to get to Cologne!**

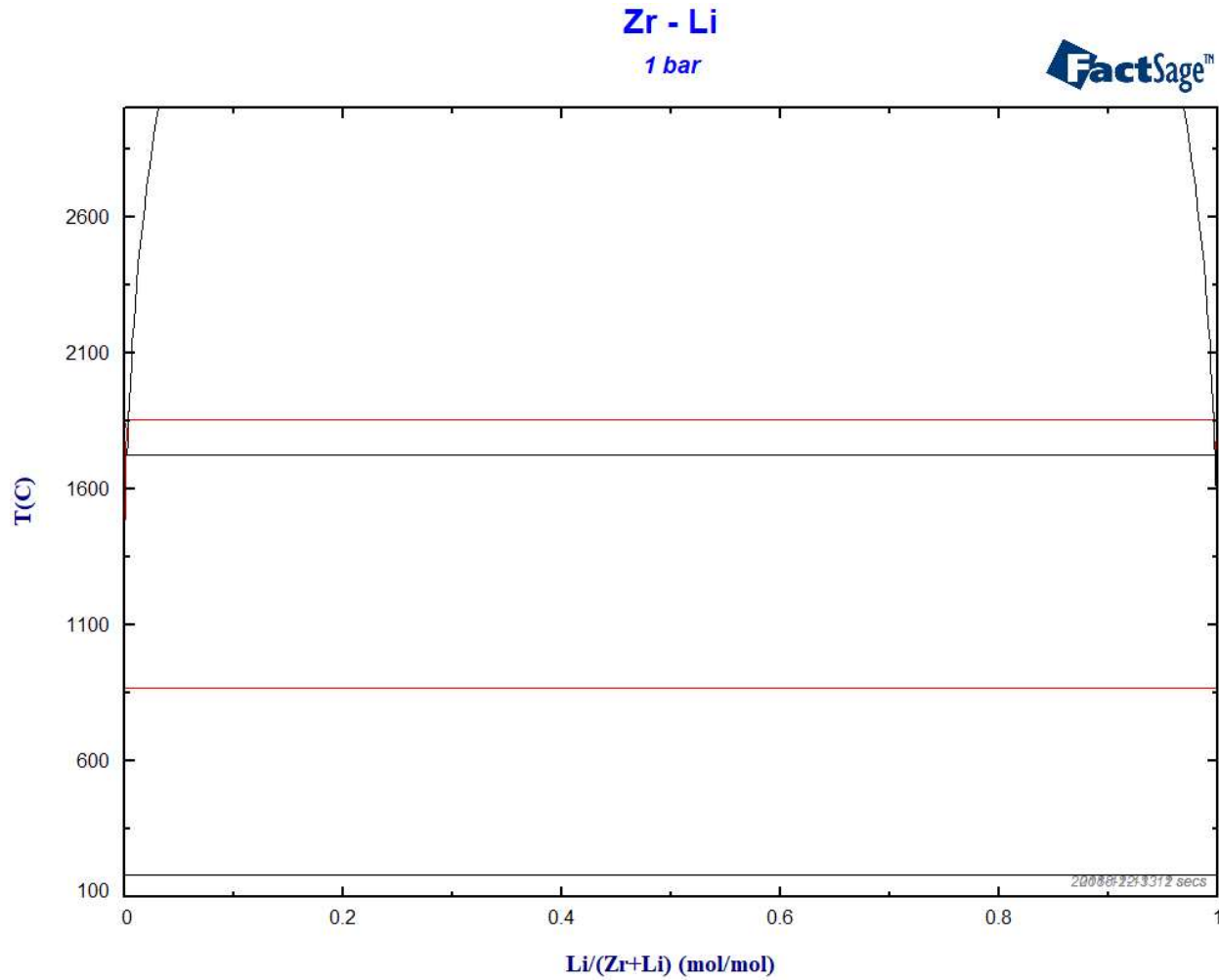


# Accuracy of aiMP (black) vs. SGTE (red)

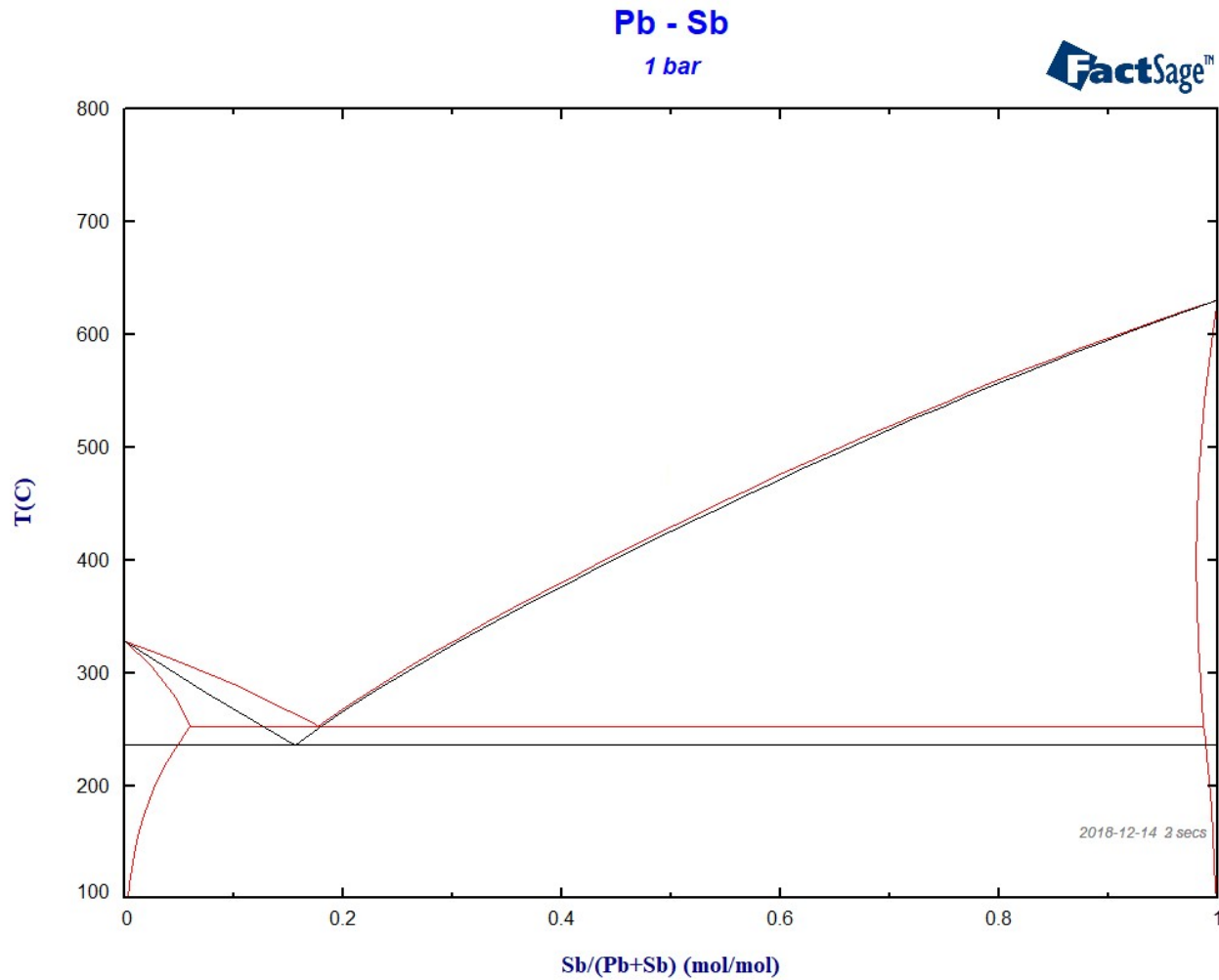




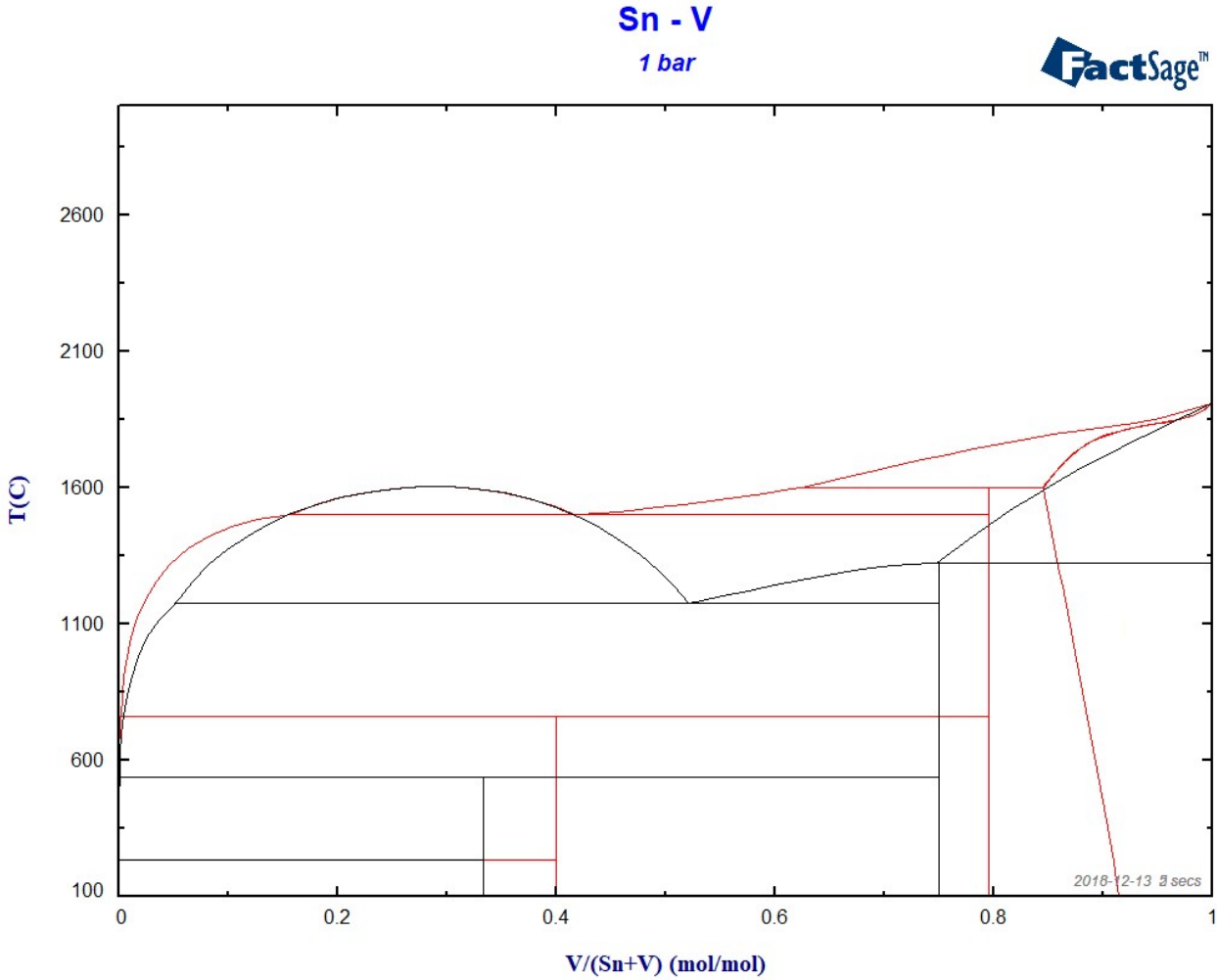
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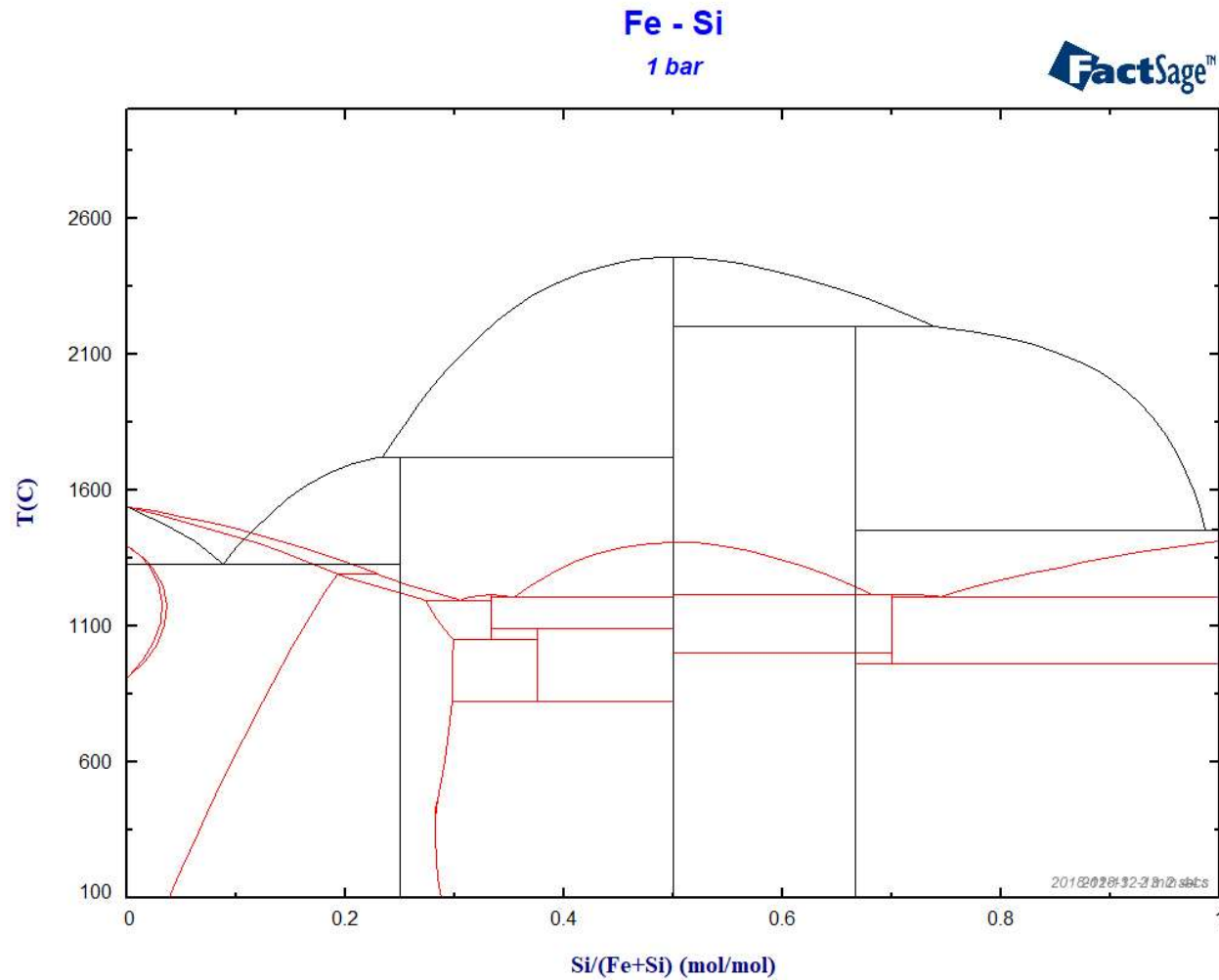
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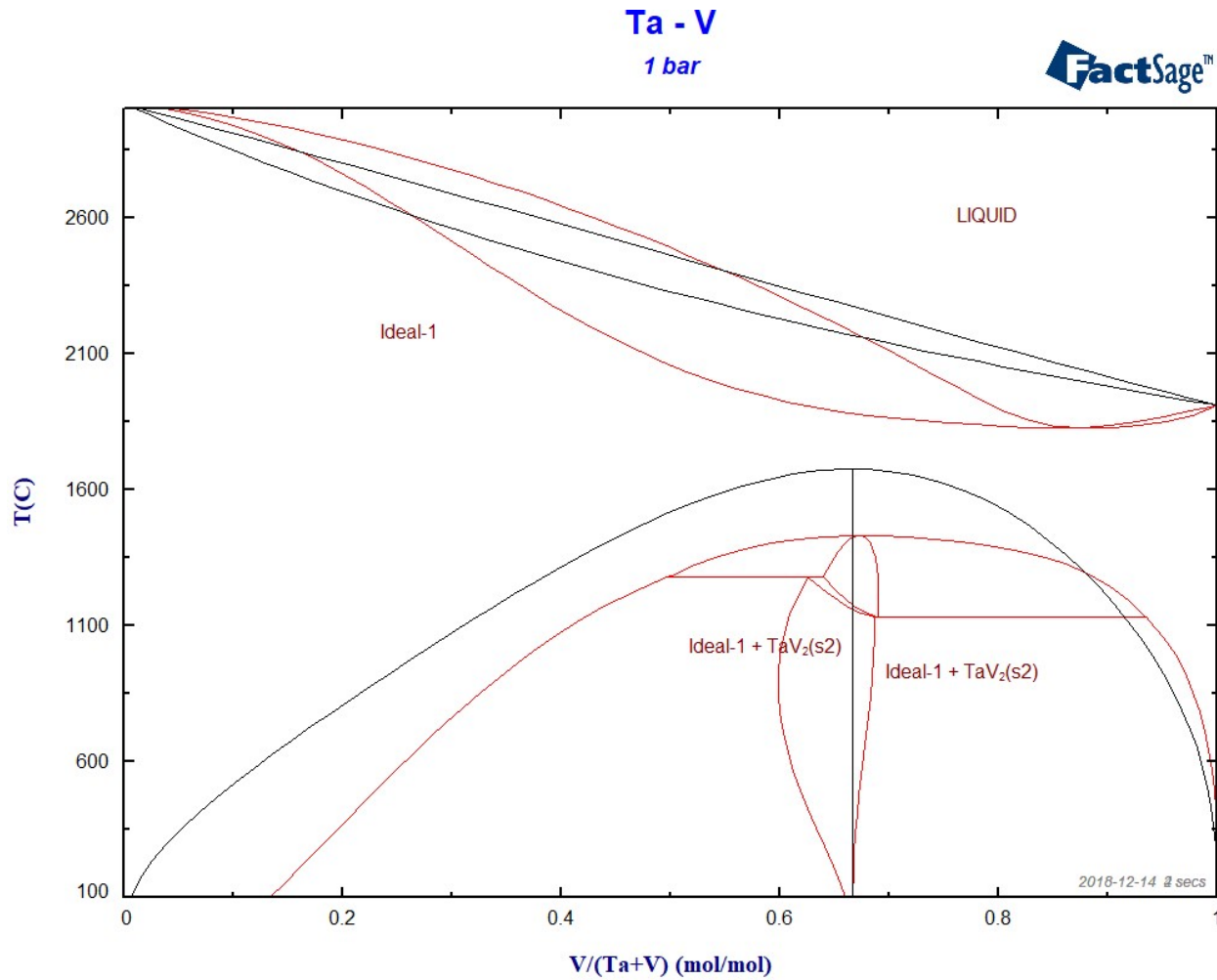
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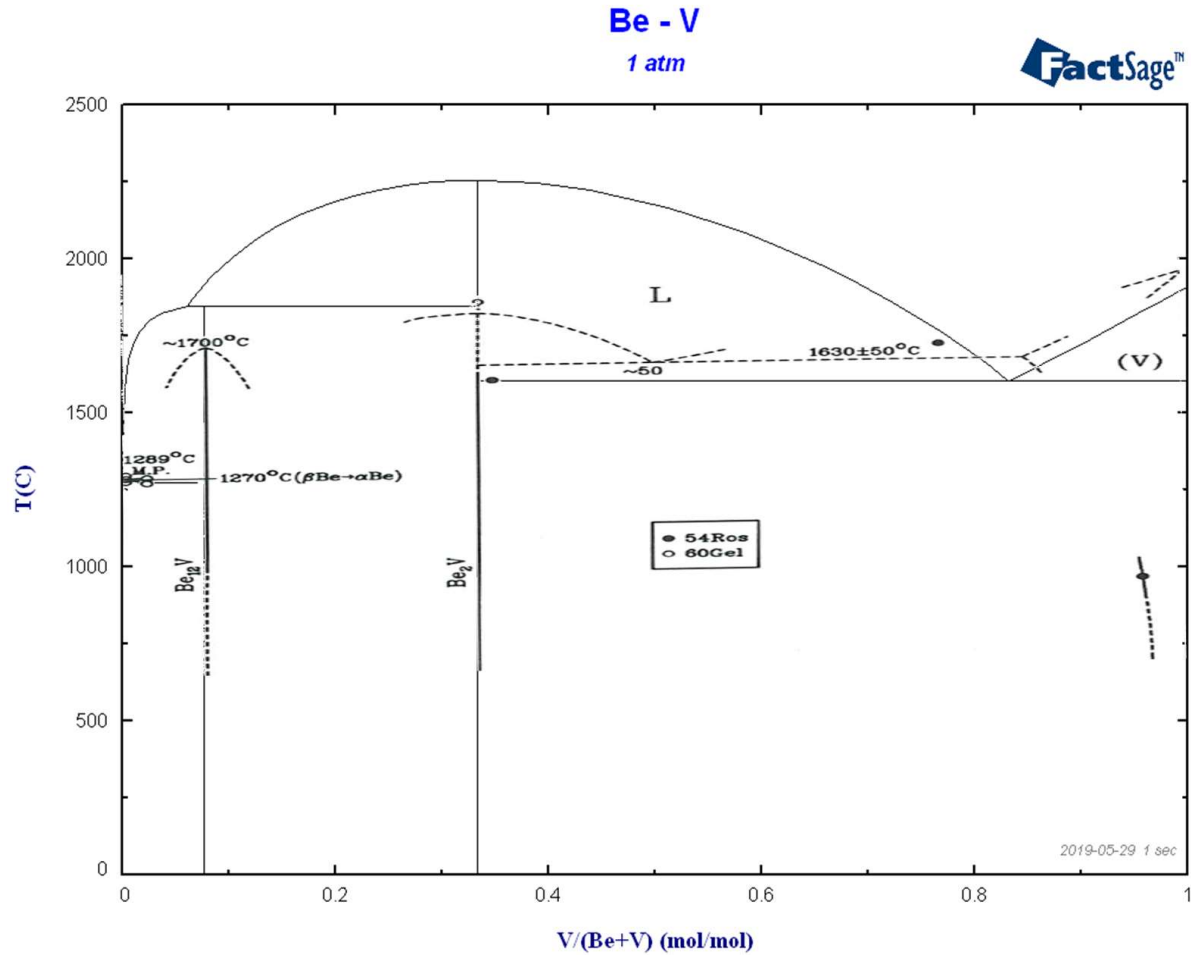
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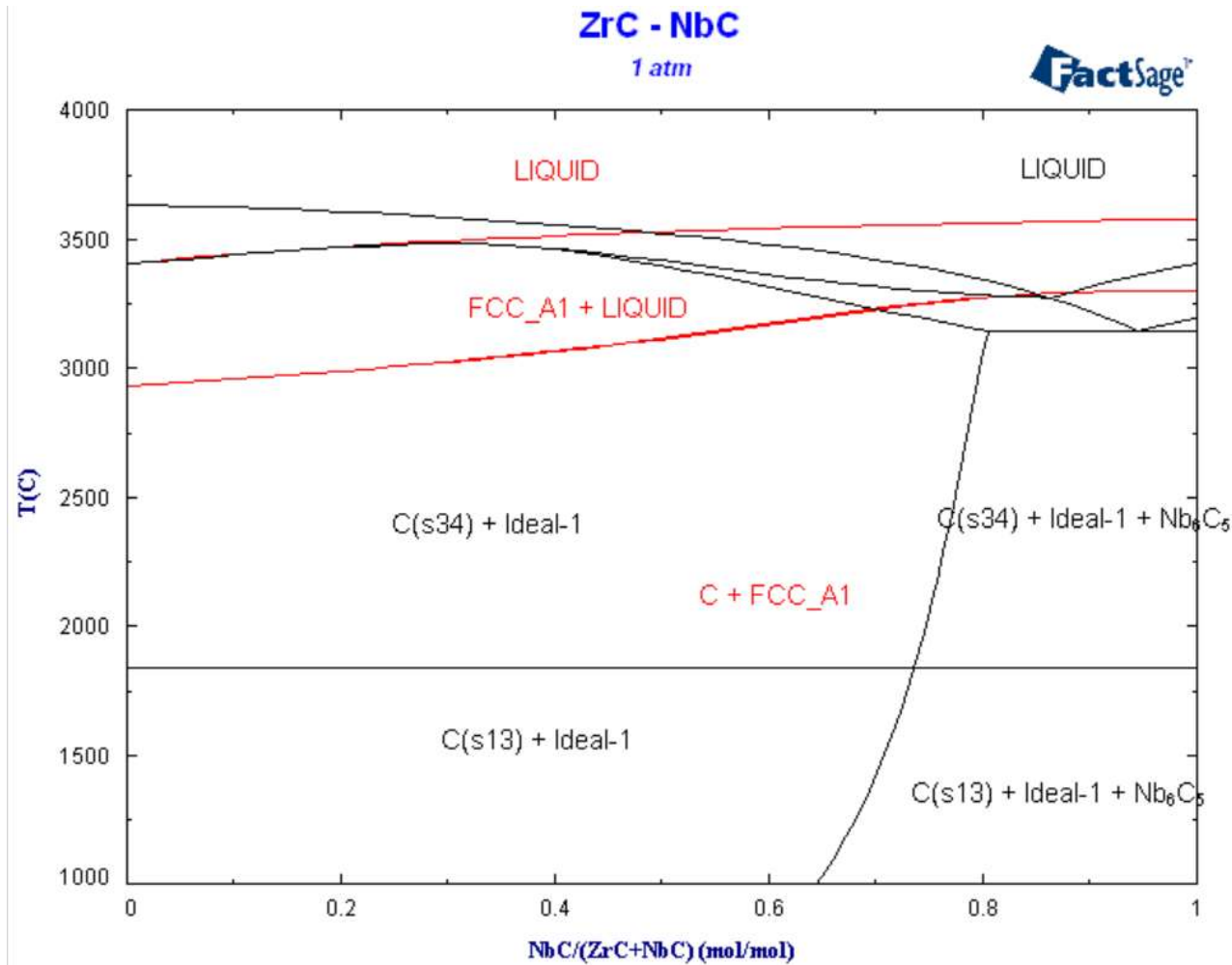
# Accuracy of aiMP (black) vs. SGTE (red)



# Accuracy of aiMP (black) vs. Phase Diagrams of Binary Beryllium Alloys, ASM1987



# Accuracy of aiMP (black) vs. SpMCBN (red)



# Another reason...

“Several years have now elapsed since I first became aware that I had accepted many false opinions for true, and that consequently what I afterward based on such principles was highly doubtful; and from that time I was convinced of the necessity of undertaking once in my life to rid myself of all the opinions I had adopted, and of commencing anew the work of building from the foundation, if I desired to establish a firm and abiding superstructure in the sciences.”

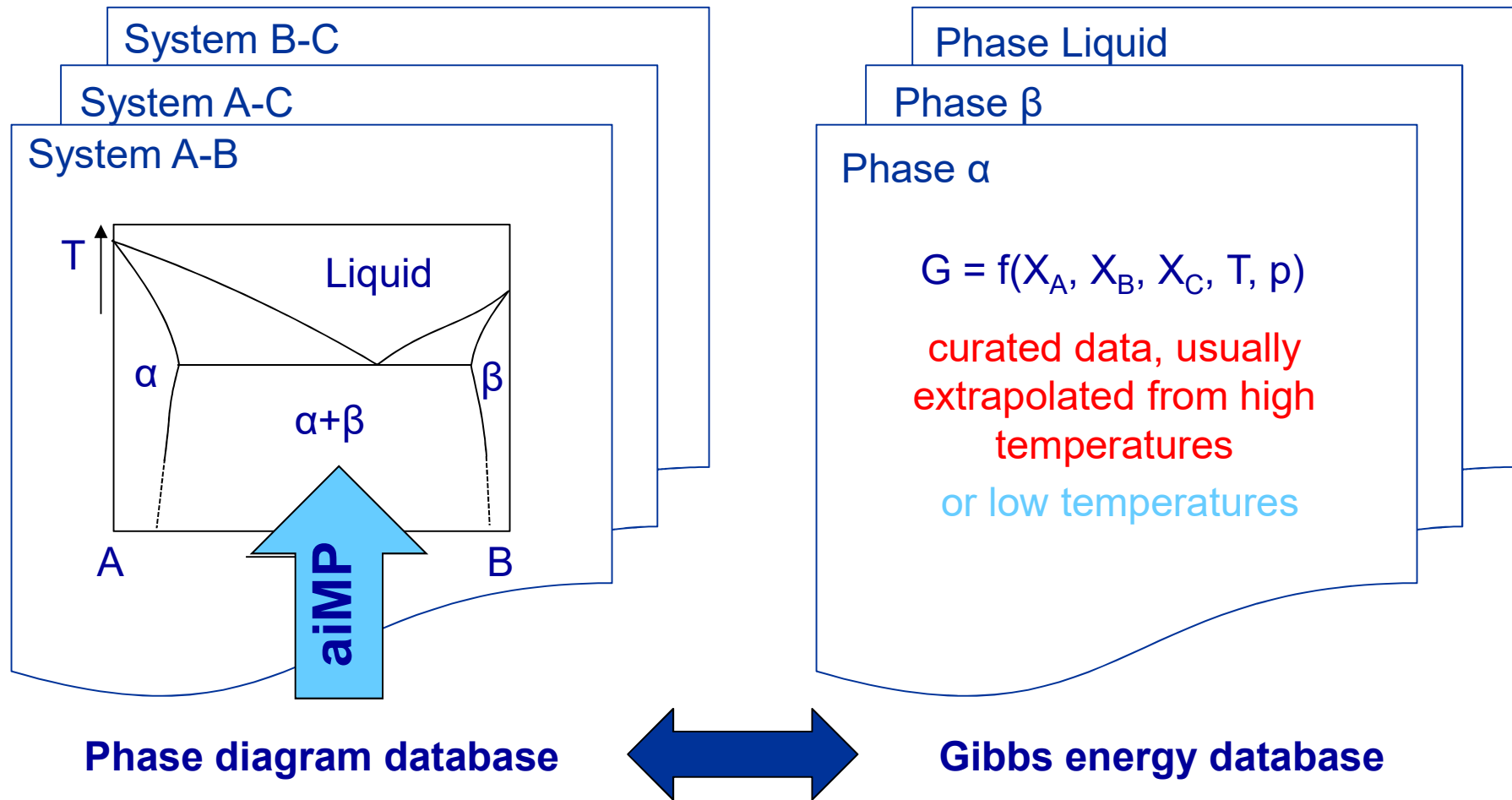
Descartes, Meditations on First Philosophy (1641)

<http://www.wright.edu/~charles.taylor/descartes/meditation1.html>

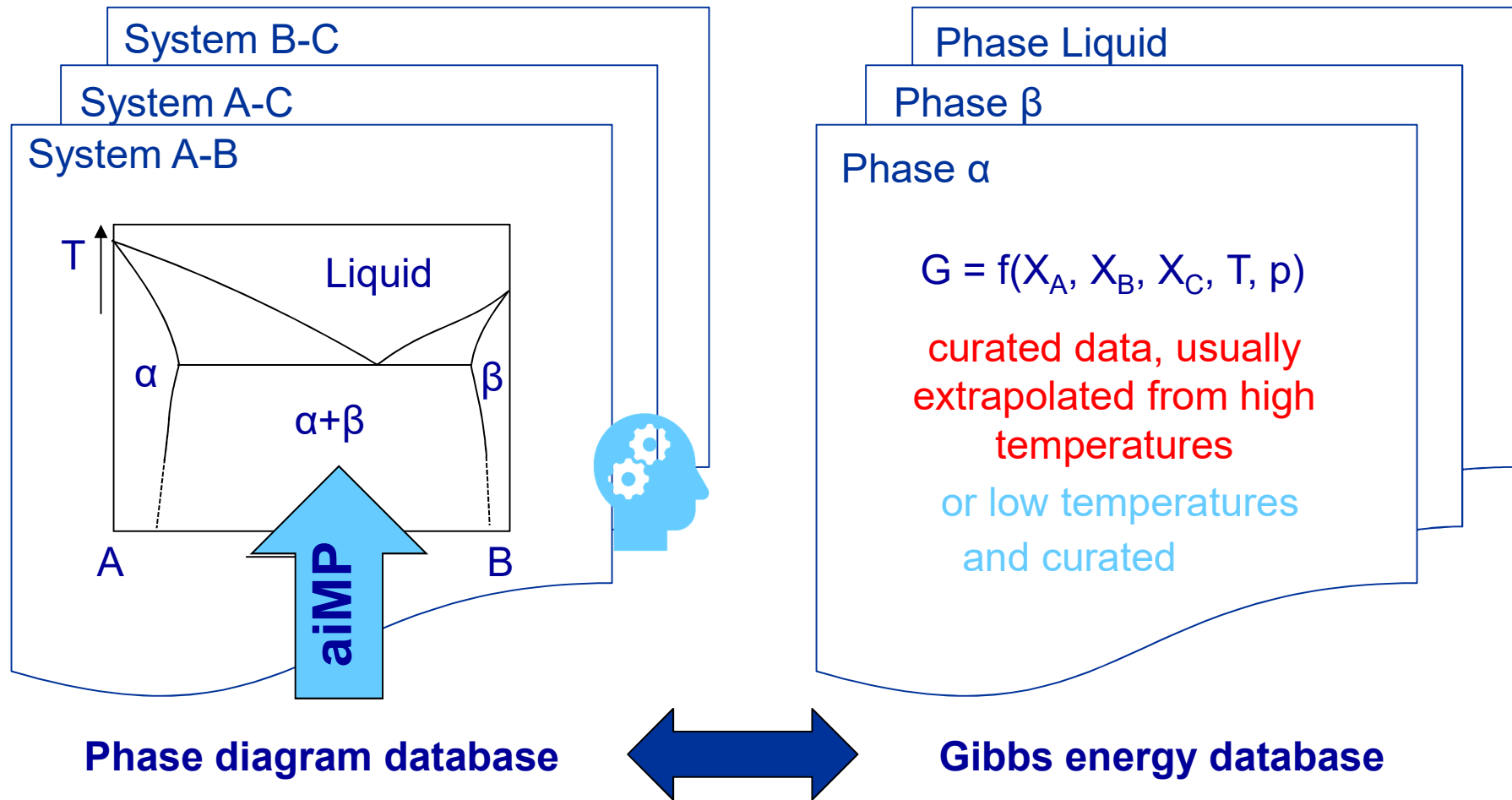




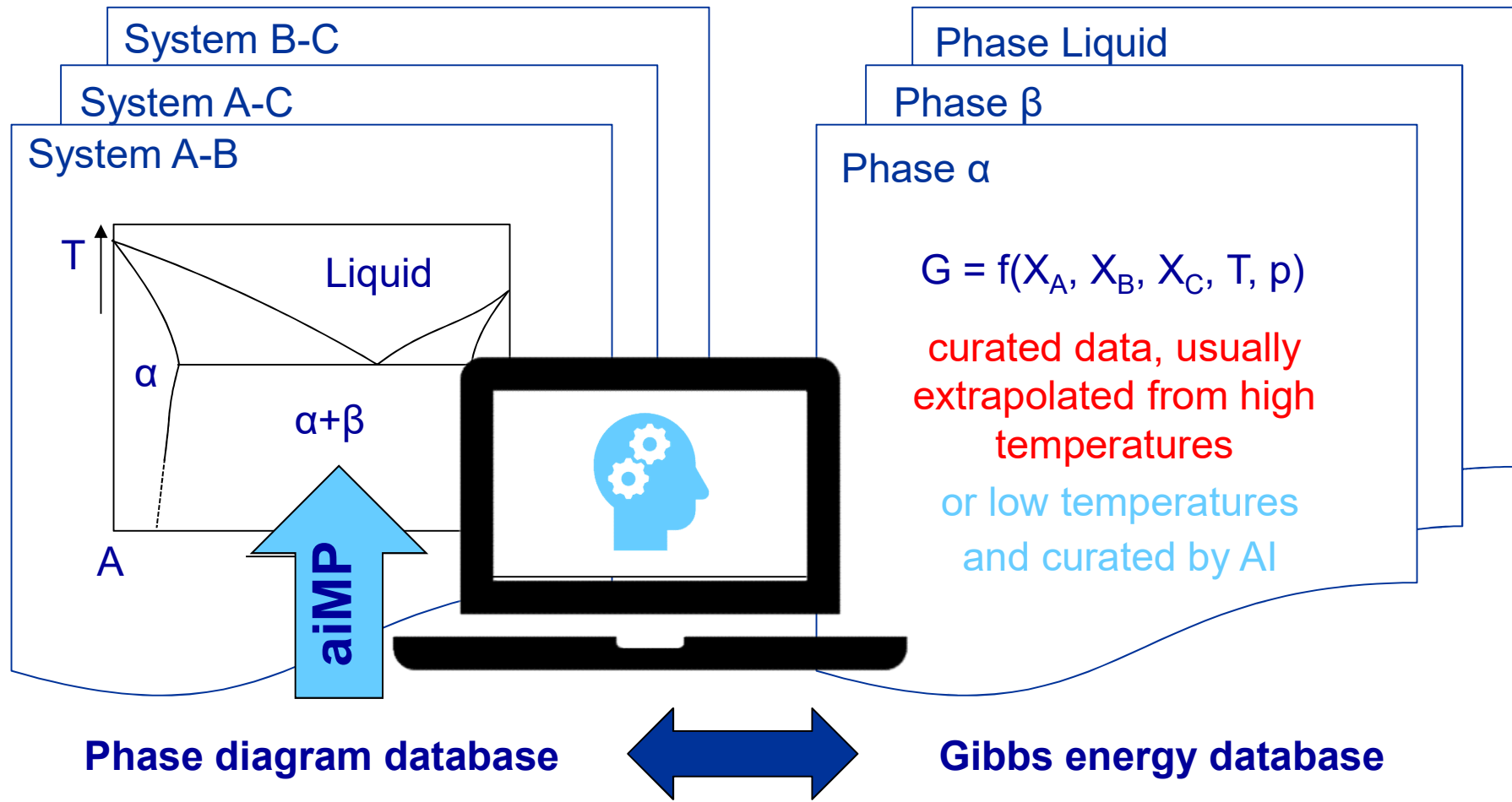
# What is the CalPhaD (Calculation of Phase Diagrams) method?



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# Roadmap

1. Metals

2. Carbides, Nitrides, Borides, Oxides

3. Sulfides, salts...

H																	He	
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# Thank you for your attention!



Bundesministerium  
für Bildung  
und Forschung

Part of the work has been supported by the German Federal Ministry of Education and Research (BMBF) in the framework of the project QuaResPro (From Quantum Mechanics to Ressource-efficient Product Desing, KMU-Innovativ 033RK058A).



**Thank you  
– and see you next year!**

**22<sup>nd</sup> GTT-Technologies Users' Meeting  
on June 24th to 26th 2020**

