

How do we shape  
the future ?

What are the critical issues to be  
addressed?

19/08/2021

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# PURE

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# Applied Sciences

# APPLIED

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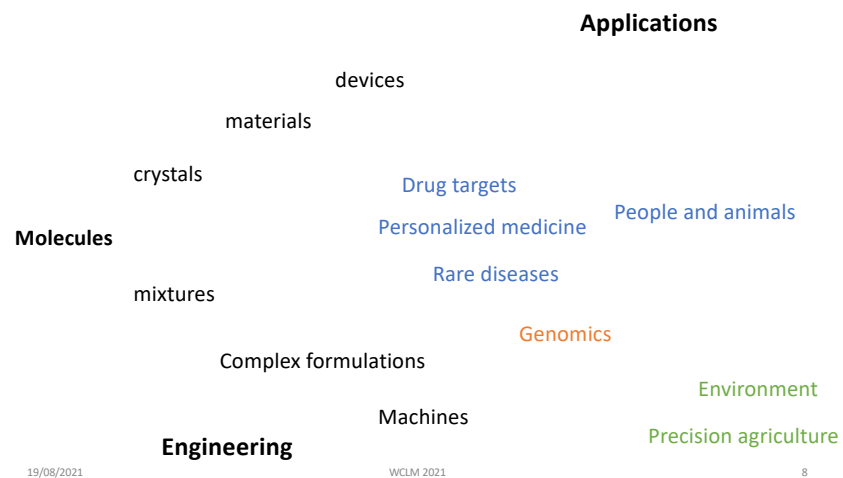
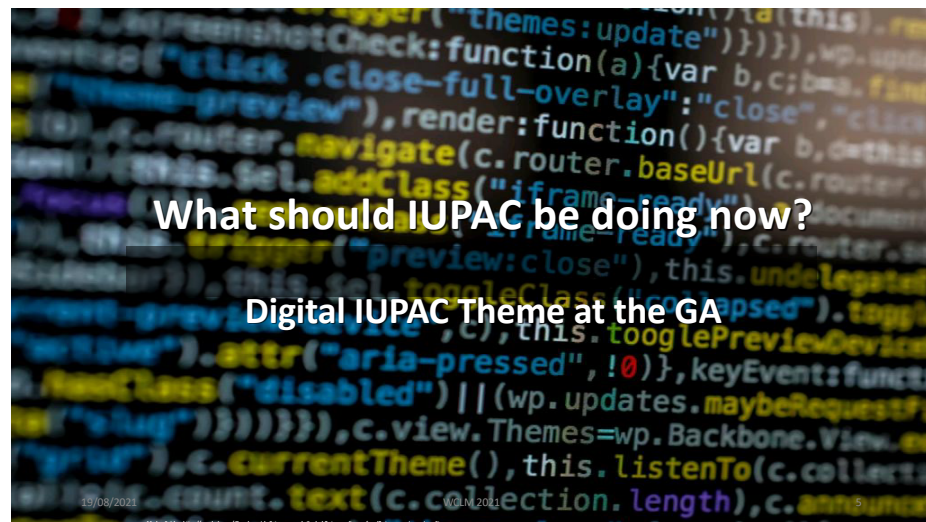
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# FORWARD

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## Vastness of chemical Space

- How have we coped so far?
- Inspired by nature!
- Imagination and creativity?



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## Characterization Techniques

*The more of chemical space we plan to explore the more molecules we need to make to provide the data and the less of each molecules we can afford to make.*

*AI needed to interpret complex measurements*

*Measurements in context needed – in the cell or device and on the field*

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<https://www.embl.org/news/lab-matters/spc-mosbri/>

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## Laws of Geography

### • The First Law

"Everything is related to everything else, but near things are more related than distant things".

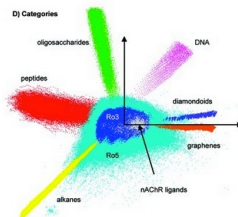
### • The Second law

"The phenomenon external to an area of interest affects what goes on inside".

maps



Chemical Space



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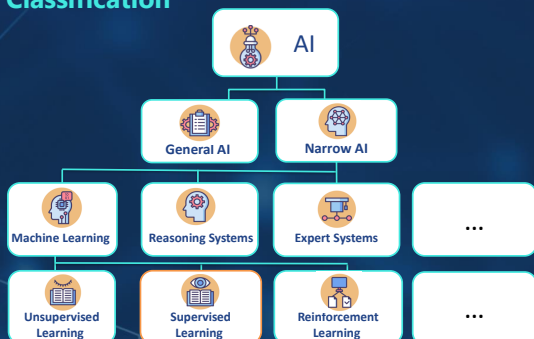
## Learning

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## AI Classification

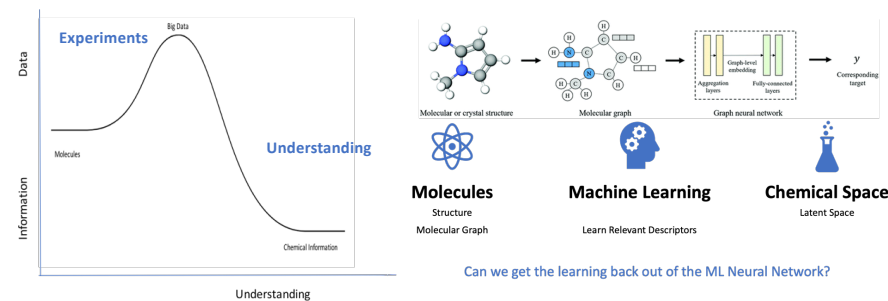


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The more data we have the more we need to throw away

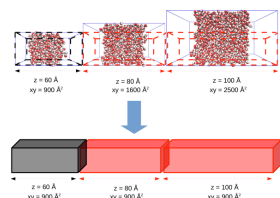


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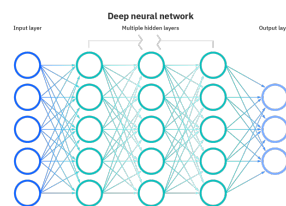
## Machine Learning, Statistical Mechanics &amp; Simulations



Molecular Dynamics

Develop Force Fields  
Faster Integrations  
Identify patterns  
Enhanced sampling

Dynamics



Machine Learning

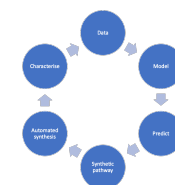
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## Generative Models

- ML network learns the essential features for molecules with selected properties (e.g., a suitable drug candidate)
- Can be used to select suitable molecules from a library
- But a generative network 'creates' possible molecules
- Then check if there is a synthetic pathway to make them!



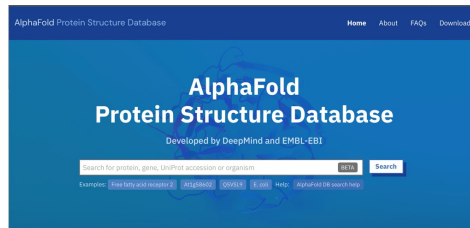
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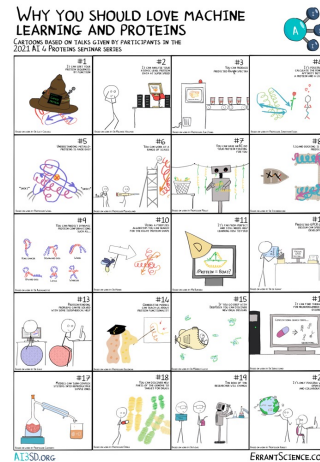


# Proteins



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## DATA Driven

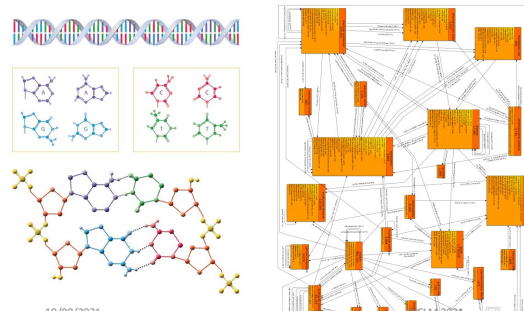
quantity  
quality  
uncertainty  
provenance  
availability  
*Data revival*

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## Graphs



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- Molecular Graphs
- Knowledge Graphs
- Graph Neural Networks

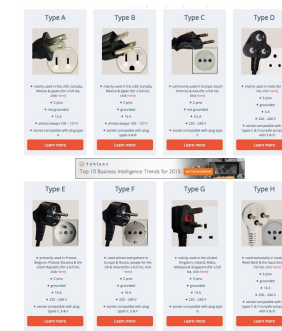
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Standards – as much time converting as extracting....



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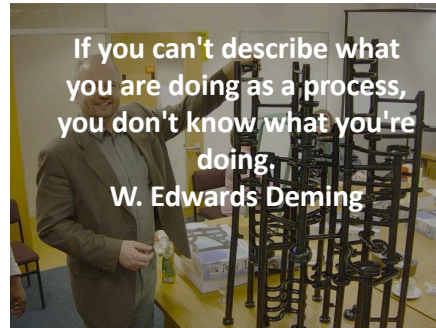
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## How do we communicate models and process?

- Surprisingly difficult to explain what a process involves
- Much of the detail is assumed to be understood and not explicitly discussed
- This is where the miss-understandings usually arise.



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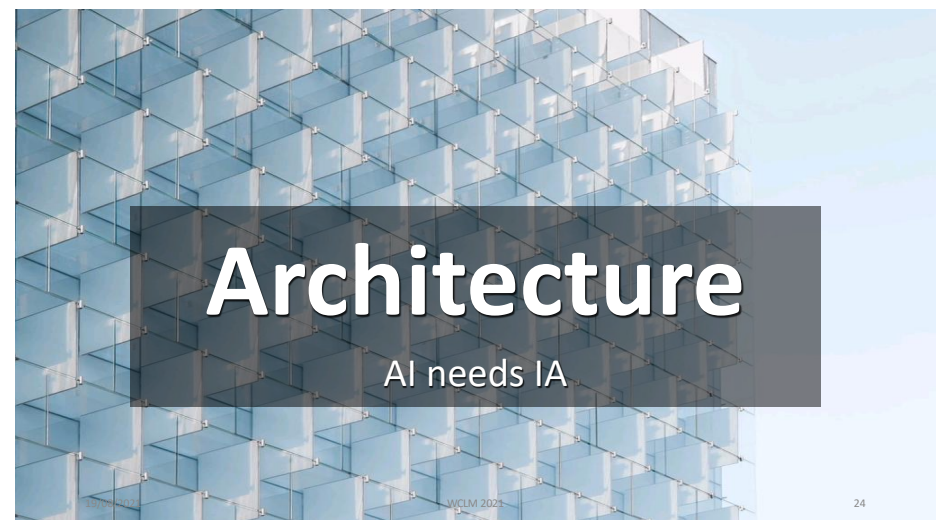
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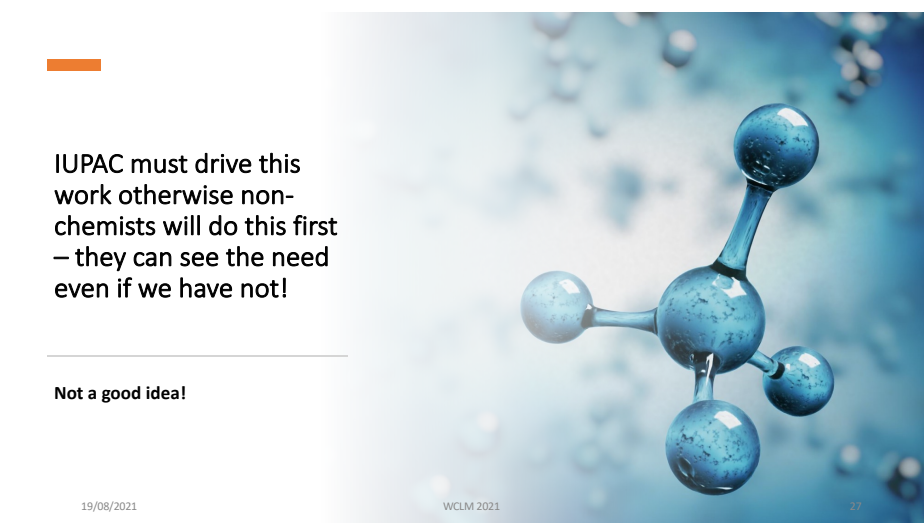


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The Logic of Scientific Discovery

# Abduction

# Outliers

## Finding the Underlying System

## Small Data Learning

Include chemical knowledge  
Deal with non-linearity



## Ethical AI – The Problems of Bias



Explainable  
Accountable  
Reproducible

All needed for  
scientific discovery

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## The Future (is ours to see)

When chemistry becomes a discipline, mathematical chemists will design new materials, predict their properties, and tell engineers how to make them — without ever entering a laboratory. We've got a long way to go on that one!

Robert A. Heinlein, "Where to?" 1950



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Should students  
give up with  
traditional  
chemistry

## Can Scientific Discovery Be Automated?

Progress in the sciences can only move as fast as humans can think—outsourcing to A.I. could change that.

AHMED ALKHATEEB | APR 25, 2017 | SCIENCE

The twin challenges of too much quantity and too little quality are rooted in the finite neurological capacity of the human mind. Scientists are deriving hypotheses from a smaller and smaller fraction of our collective knowledge and consequently, more and more, asking the wrong questions, or asking ones that have already been answered. Also, human creativity seems to depend increasingly on the stochasticity of previous experiences—particular life events that allow a researcher to notice something others do not. Although chance has always been a factor in scientific discovery, it is currently playing a much larger role than it should.

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# The Laboratory

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## AI enabled ELNs

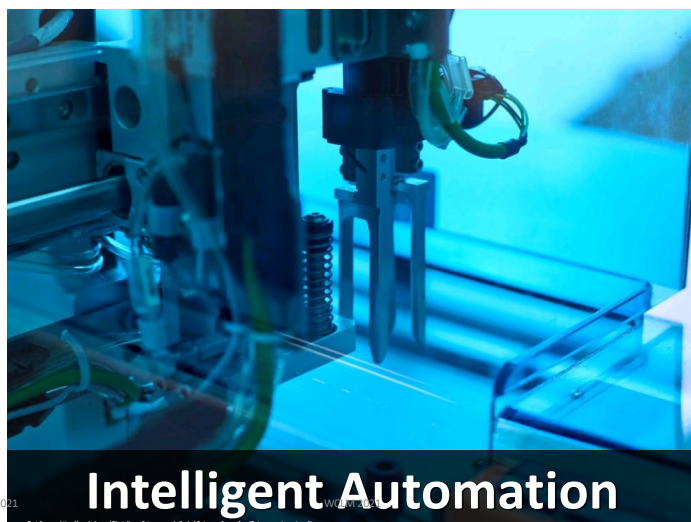
Quality annotated record  
Telling the story  
Machine readable

Talk2Lab  
*AI in the Lab*

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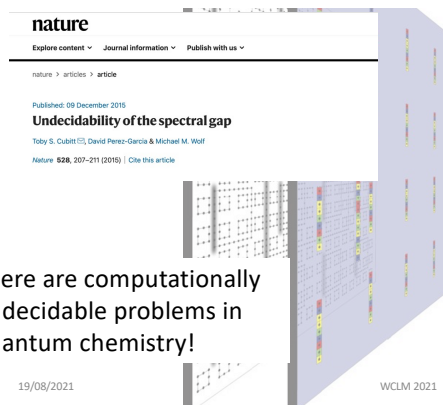
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# Intelligent Automation

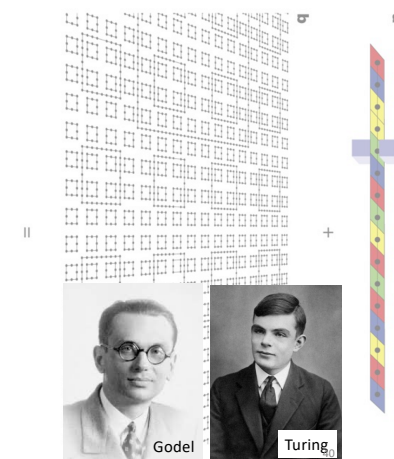
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## Limits of Chemical Computation

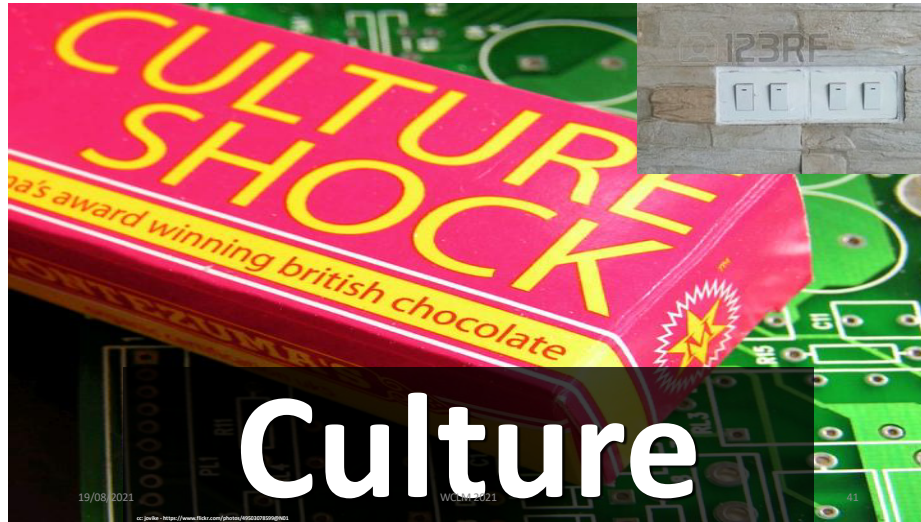


There are computationally undecidable problems in quantum chemistry!

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## Sustainability

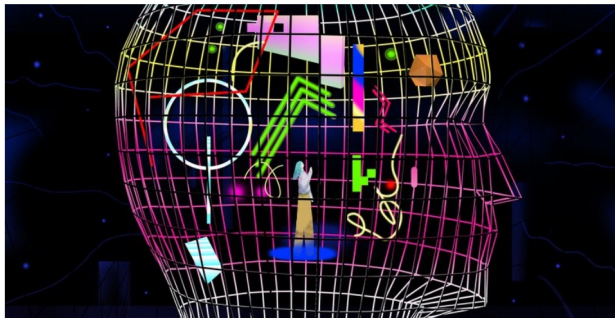


<https://news.un.org/en/story/2015/12/519172-sustainable-development-goals-kick-start-new-year>

## We are still in a Liminal period



A Key worry



Overreliance on artificial intelligence may put us in intellectual debt. Illustration by Jon Han

Overreliance on AI may put us in intellectual debt



All I am saying is that now is the time to develop the technology to deflect an asteroid



Thanks

Thank you for listening



Trust me Mort - no electronic communications superhighway, no matter how vast and sophisticated, will ever replace the art of the schmooze