

### Hands-On Workshop in nanoHUB: Machine Learning Models for Ionic Conductivity with Schrödinger's AutoQSAR

Dr. Michael Rauch, Materials Science Education Lead, Schrödinger



# The Schrödinger Platform: An integrated solution for digital materials discovery and analysis

- A streamlined intuitive GUI for structural visualization, cutting-edge predictive atomistic simulation and machine learning workflows for Materials Science discovery and analysis.
- A powerful web-based informatics and molecular design platform that enables team to rapidly advance materials discovery projects by collaborating, designing, experimenting, analyzing, tracking, and reporting in a centralized platform.

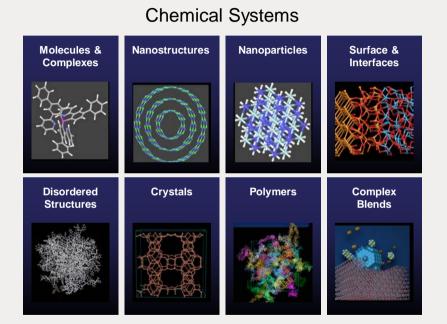


Build advanced models or systems Run simulations or automated workflows Predict properties and performances

Analyze and Screen Guide experimental design



### **Atomistic Simulation Across Diverse Systems and Applications**

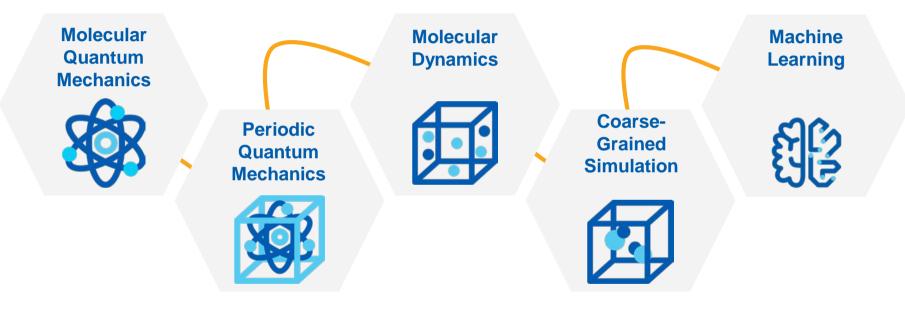


#### Application Verticals

Organic Electronics	Polymeric Materials	Consumer Packaged Goods	Catalysis & Reactive Systems
Semiconductors	Energy Capture & Storage	Complex Formulations	Alloys, Metals & Ceramics
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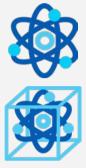


### **Methods Power Capabilities**





### **From Engines to Workflows**



*Jaguar* Molecular Quantum Mechanics

*Quantum ESPRESSO* Periodic Quantum Mechanics multistage workflows, optoelectronic properties, automated reaction workflow

adsorption energy workflows, surface energy, microkinetics



Desmond All-Atom Molecular Dynamics

I

Desmond Coarse-Grained Simulation

> AutoQSAR Machine Learning

multistage workflows, thermophysical properties, crosslinking

multistage workflows, automated DPD parameterization & Martini mapping

materials descriptors, built-in property prediction, active learning



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### EXTRAPOLATIONS

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Modernizing the Mining Industry with Digital Simulation

BY ANDREW JACKSON | JAN 18, 2023



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Driving Sustainability at Reckitt through the Adoption of Molecular Simulations BY MARTIN SETTLE & MARIAM HUSSAIN | MAR 21, 2022

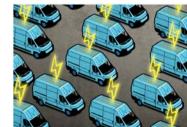


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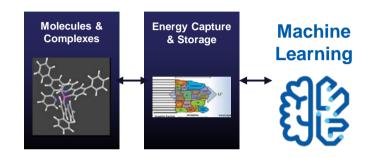
Collaborations

Science & Innovation

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### **Today's Example**



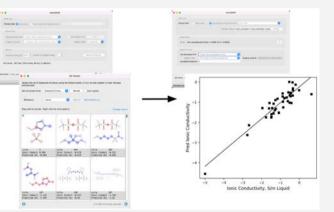




### **Today's Example**

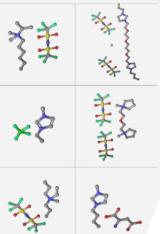


## Model Generation and Application

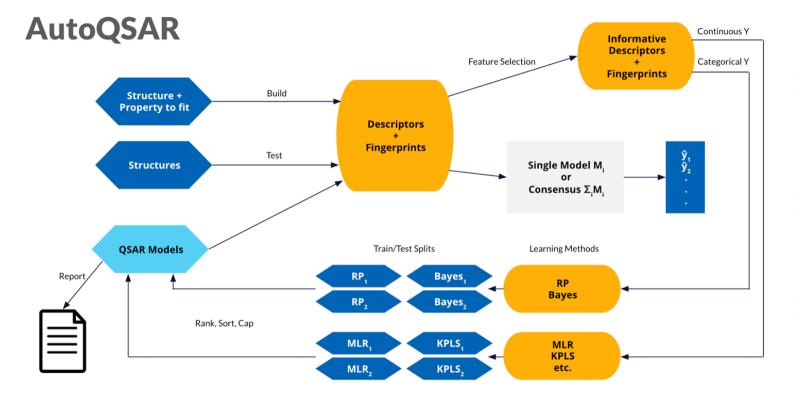


#### **ML Data Input**

	Ionic Conductivity, S/m Liquid	Temperature, K	SMILE	Index
	0.204459143	298.15	F(B-)(F)(F)F.C(C)(N+)1+CN(C+C1)C	2
	-0.677780705	308.1	[N-](S(=0)(=0)C(F)(F)F)S(=0)(=0)C(F)(F)F.C(C)(N+)(CCC)(CCC)C	344
	-0.920818754	295.1	FC(S(+O)(+O)(N+)S(+O)(+O)O)P)(F)F)(F)(F)(F)(C)(C)(C)(N+)(CCCCCC)(C)(C)	333
	-1.124938737	298.15	N[CBH][C[+O][O-][CC[+O]O.C[CCC][NH+]1CN[C+C1]C	137
	-0.91721463	298	F0(5(+0)(+0)(N-(5(+0)(+0)0)F)(F)(F)(F)(F)(C(CC)N+(1)(CCCC1)C)(CC)N+(1)	238
	-1.142667504	298	C(COCCOCCCC(N+)1=C(N)(C=C1)CCCC)(N+)2=C(N)(C=C2)CCCC.	237
	-0.8569852	298,1	F(B-)(F)(F)F.C(C)(N+)1+CN(C+C1)CCCCCC	387
	-0.899629455	298.15	S(=O)(=O)(OC)(O-].C(CCC)(N+)1=CN(C=C1)C	138
	-0.679853714	298.15	[N-](SL=0)(=0)C(F)(F)(F)(SL=0)(=0)C(F)(F)(F)(F)(COCCC)(N+[1)(CCCCC1)C	223
<u>_</u>	-0.876148359	298.15	[N-](S(=0)(=0)C(F)(F)(F)(S(=0)(=0)C(F))(F)(F)C(CCCCCCCC)(N+]1=CN(C=C1	109
~	-0.838631998	303	[N-](S(=0)(=0)C(F)(F)F)S(=0)(=0)C(F)(F)F[NH+]1=CC=CC=C1.C(CCC)#I	150
5	-1.232473101	298.15	F[B-](F)(F)F.C[N+]1=CN(C+C1)CCCCCCCC	11
~ «	-0.396855627	298.15	F(B-)(F)(F)(F)(C(C)(N+)1+CC+CC+C1	27
- 2	-0.565431096	298.15	FOIS(=OI(=OINS(=OI(=OIC)F)/F)/F)/F)/FOICCCI(N+)1=CC(=CC=C1)C	47
>	-0.823908741	295.1	FC(S(+O)(+O)(N-(S(+O)(+O)O)F)(F)F)(F)(F)(F)CCC(N+)(C(C)C)(C)C	331
ď	-1.397940009	298.1	[N-](SL=0)(=0)C(F)(F)F)SL=0)(=0)C(F)(F)F)C(CCCCCCC)(N+])C)(C)C	376
	-1.795880017	298.1	[N-][SI=0((=0)CIF)[F]F[SI=0)(=0)CIF)[F]F[C]CCCC][N+][CCCCCCC][CCCC]	381
	0.116607744	298.15	[N-](CHN(CHN.C(CC)[N+]1+CC+CC+C1	194
	-1.153168247	303.15	C(CC)(=O)(O-],C(CCC)N1C(NH+)(C=C1)C	183
	0.459249207	298.15	[N-](C#N)C#N.C(C(N+]1+CN(C+C1)C	63
	-1.05207638	298.15	[N-](SI-0)(=0)C(F)(F)F)S(=0)(=0)C(F)(F)F;C(C)(N+)(CCCCCC)(CC)CC	10
	-0.415668776	298.15	FC(S(+O)(+O)(N+)S(+O)(+O)O(F)(F)(F)(F)(F)(F)(C)(C)(P+)(CCOC)(CC)(CC)	148
	-0.958607315	295.1	[N-](SL=0)(=0)C(F)(F)C(F)(F)(F)SL=0)(=0)C(F)(F)C(F)(F)C(F)(F)(F)C(CCCCCCC))N+	288
	-0.453457337	298.15	F(B-)(F)(F)(F)(C)(C)(N+)1+CN(C+C1)C	6
	-0.745210313	298.2	[N+]]=0([0-]](0-].CN1C=N[N+]]=C1)CCC	81
	-0.412289035	298.15	FO(5(=0)(=0)(N-(5(=0))=0)O(F)(F)(F)(F)(F)(C)(O(CN1C=(N+))(C=C1)C	163
	-1.062983893i	298.15	CC1+CC+O(C+C1)S(=O)(=O)(O-].C(C)(N+]1+CN(C+C1)C	
	-1.045757491	298.1	P(=0)(0CC)(0CC)(0-].C(C)(N+)1=CN(C=C1)C	384
	-0.29627884	299.1	FIP-)(F)(F)(F)(F)F,O(C)(N+)1+ON(C+C1)C	21
	-2	295.1	FC(S(+O)(+O)(N+)S(+O)(+O)O(F)(F)(F)(F)(F)(F)(OO(C(N+)1(CCCC1)C)(OO	338
	0.000000000			-









### nanoHUB Access

Login to nanoHUB and request to join the Schrödinger group

https://nanohub.org/groups/schrodinger

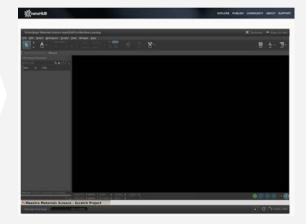
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Go to Schrödinger Materials Science AutoQSAR for Machine Learning tool

#### https://nanohub.org/tools/autoqsar



#### Launch the Tool and Accept the EULA





### Live Demo



### **Next Steps**



Continue Exploring Schrödinger Materials Science Through nanoHUB

Two other datasets are available in nanoHUB for widespread educational use (thermally activated delayed fluorescent materials & homogeneous catalysts)



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# Questions? Thank you!