

# Modeling and Simulation for the Petrochemical Industry



# Commitment to innovation, software, and support





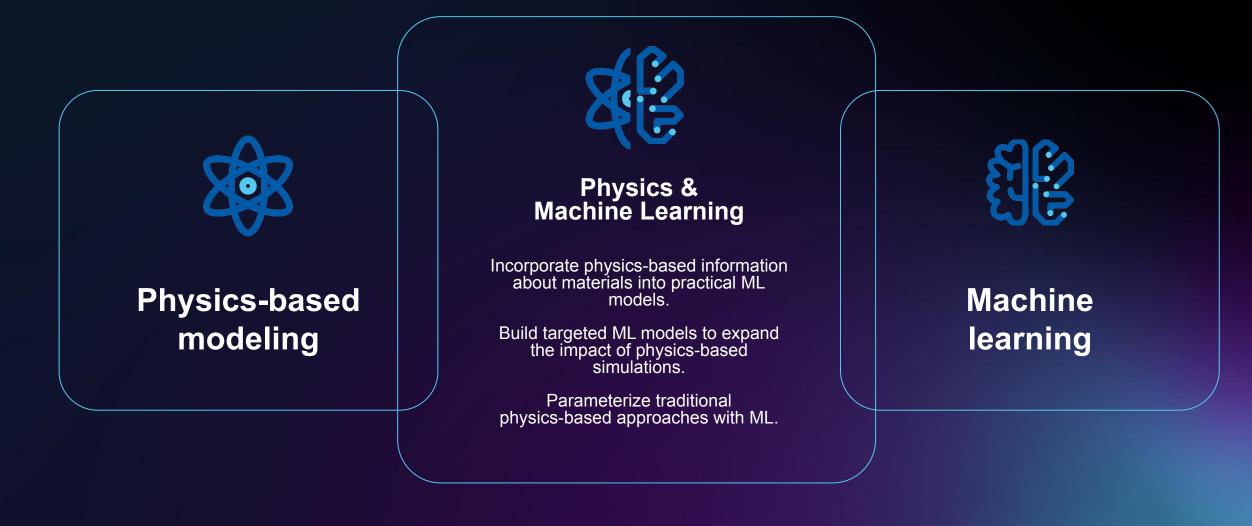
# **Engagement models**



### **TECHNOLOGY PLATFORM**

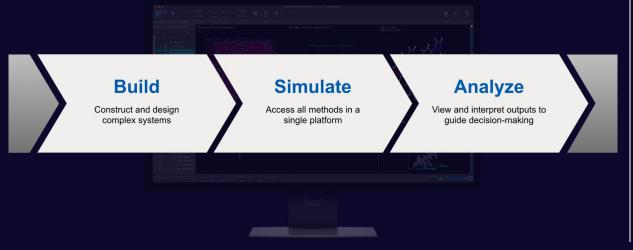


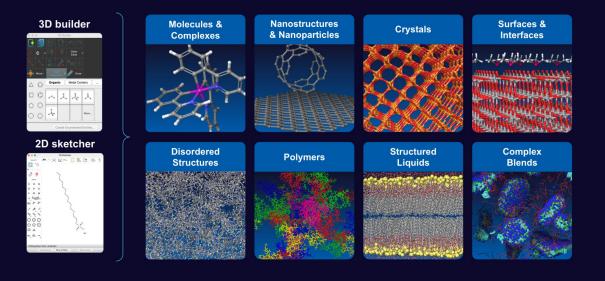
# Synergy between physics-based modeling and machine learning

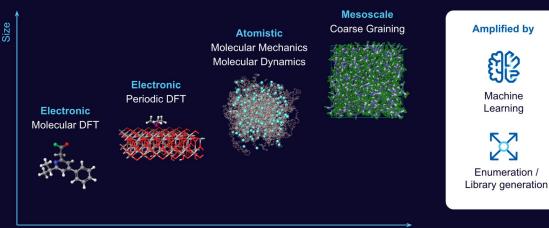




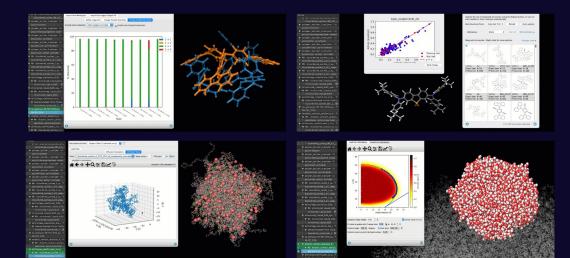
# **Physics-based modeling**





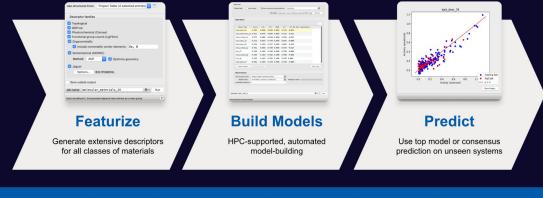


Time

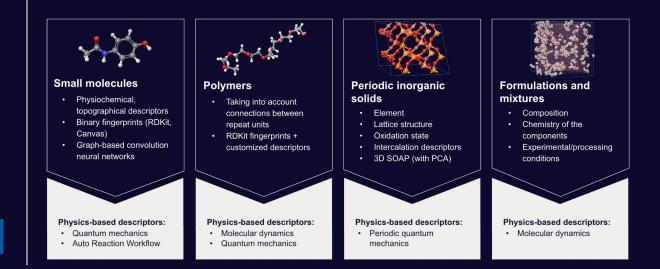


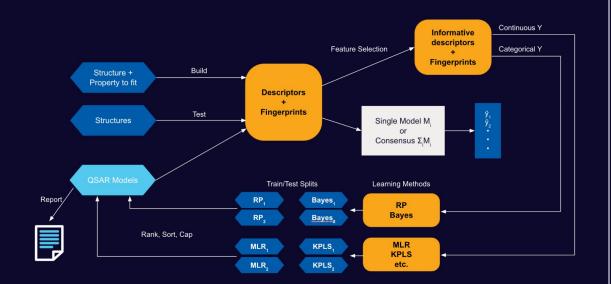
Schrödinger

# **Machine learning**

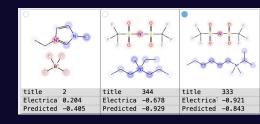


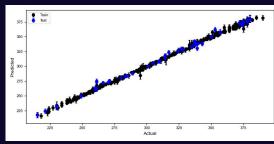
Capabilities for: small molecules, organometallics, polymers, periodic inorganics, and formulations

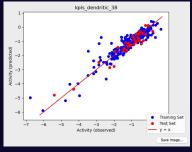




Model Code v Score S.D. R^2 RMSE Q^2 Q^2 MW (Null kpls\_dendritic\_38 0.8590 0.3468 0.8584 0.3451 0.9036 -0.0071 kpls linear 38 0.8319 0.3664 0.8415 0.3770 0.8849 -0.0071 0.4017 0.8216 0.3384 0.8400 0.0146 kpls\_linear\_40 0.8277 kpls dendritic 40 0.8159 0.4099 0.8142 0.3912 0.7862 0.0146 kols linear 23 0.4215 0.8030 0.4084 0.7662 0.0185 0.8039 kpls\_dendritic\_23 0.7941 0.4329 0.7921 0.4143 0.7592 0.0185 kpls\_radial\_21 0.7907 0.4468 0.7836 0.3907 0.7218 -0.0164 kpls radial 22 0.4213 0.8015 0.4255 0.7829 0.0192 0.7833 kpls\_radial\_34 0.7805 0.4554 0.7710 0.3895 0.7850 0.0250 0.7793 0.4492 0.7753 0.4219 0.7535 -0.0130 knls linear 5









# Integrated simulation approaches

#### Jaguar

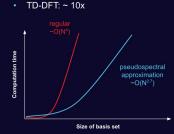
A high-performance quantum chemistry software program leveraging the pseudospectral approximation method

#### Key capabilities:

- Extensive coverage of functionals, basis sets, and properties, see <u>Jaguar Data Sheet</u>
- Geometry optimization, transition state search, thermochemical properties, implicit solvation, spectra prediction, and more
- Automated solutions: pKa prediction, conformationally averaged VCD and ECD spectroscopy, tautomer generation and ranking, heat of formation, etc.
- Publication-quality 3D surfaces: molecular orbitals, electrostatic potential projected on isodensity, spin density, non-covalent interactions, etc.

#### Speed-up (hybrid DFT):

- Single points: ~ 2-4x
- Geometry optimizations: ~ 2-3x
- Second derivatives: ~ 2x

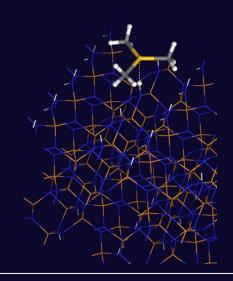


### **Quantum ESPRESSO**

Automated solutions, including builders and analysis tools for performing periodic DFT calculations

#### Key capabilities:

- · Predictions for bulk, surface, and interface properties
- Support Ultrasoft (US), Norm-Conserving (NC) and Projector Augmented Wave (PAW) pseudopotentials
- Perform structural optimization and ab initio molecular dynamics
- Simulate transition states and minimum energy paths with nudged elastic band (NEB) method
- Model linear response properties within Density Functional Perturbation theory (DFPT)
- Predict spectroscopic properties



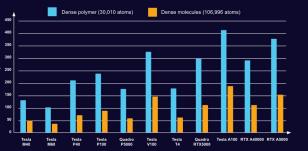
### Desmond

High-performance molecular dynamics (MD) engine providing high scalability, throughput, and scientific accuracy

#### Key capabilities:

- GPU
- OPLS and coarse-grained force fields
- Enhanced sampling including replica exchange
- Extensively validated for materials science applications

#### Desmond Molecular Dynamics Performance

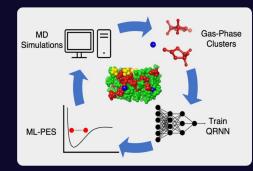


### **Machine Learning Force Field**

Leverage training data from ab initio and classical approaches to generate accurate and fast case-specific force fields

#### Key capabilities:

- Training data from quantum mechanics (Jaguar, QuantumESPRESSO) and classical molecular dynamics (Desmond)
- Charge recursive neural network
  (QRNN) architecture
- Validated approach for various materials science applications





Single platform advantage

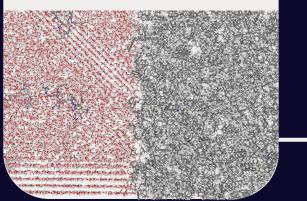




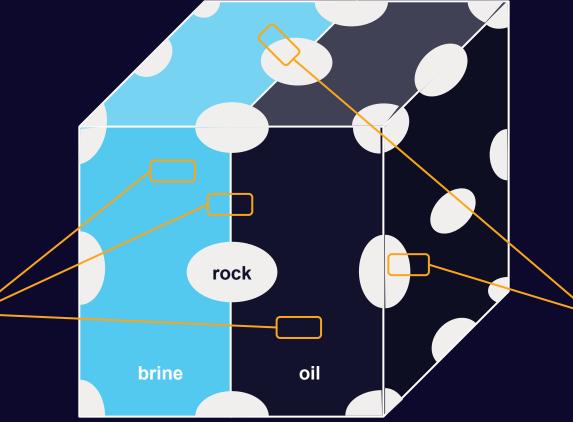
Molecular dynamics and coarse-grained (MD & CG) modeling of brine, oil, and the brine-oil interface

Components: water, salts, hydrocarbons, cycloalkanes, aromatics, olefins, resins, asphaltenes, polymers, surfactants, nanoparticles, etc.

Outputs: energies, forces, morphology, density, interfacial tension, wettability, viscosity, diffusivity



### **Upstream Modeling Framework**



Machine learned force field (MLFF) for comprehensive upstream modeling

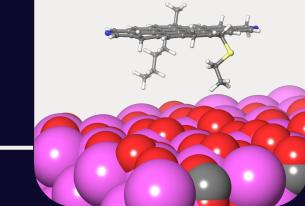
'Universal' model with full component coverage of relevant chemical space



Quantum mechanical (DFT & AIMD) modeling of the brine/rock and oil/rock interface

Components: hydrocarbons, cycloalkanes, aromatics, olefins, resins, asphaltenes, rock minerals/scale-forming compounds, etc.

Outputs: energies, forces, bulk and surface properties, reactivity





Brine/oil/rock graphic adapted from: Kirch, A. et al. Multiscale Molecular Modeling Applied to the Upstream Oil & Gas Industry Challenges. Polytechnica 3, 54–65 (2020).

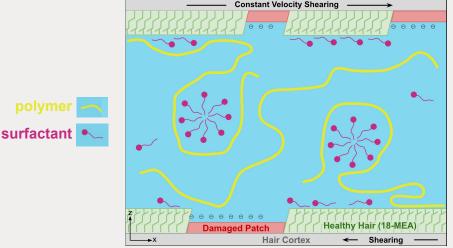
### **Classical simulations**

Schrödinger unique advantage:

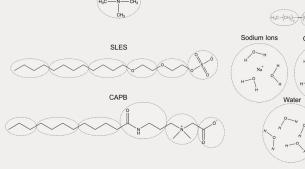
- Desmond GPU enables large system size and long simulation time
- Out-of-the-box OPLS force field provides excellent materials coverage
- Automated particulation and force field parameterization enables facile linking of molecular and meso-scales

### Relevant experience:

- L'Oreal: blog, paper
- AbbVie: paper, case study
- Evonik: white paper
- Internal expertise
- 100+ contract research projects



Schematic from complex coarse-grained approach employed in a surfactant emulsion project





# **Quantum calculations**

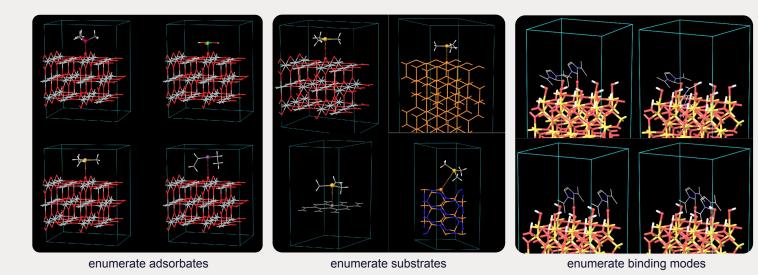
Schrödinger unique advantage:

- Efficient builders for structure generation, slab generation, and adsorbate enumeration
- Extensive experience with at-scale, cloud-based high-throughput quantum mechanical calculations

Relevant experience:

- Panasonic: <u>blog</u>, <u>paper</u>
- Public collaborations:
  - Eonix: blog
  - Copernic: blog
- Internal expertise
- 100+ contract research projects

Rapid adsorbate enumeration capability for high-throughput system building





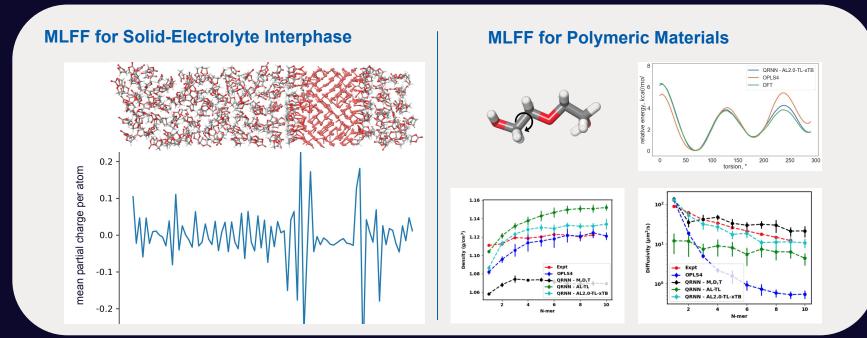
### **Machine learned force field**

Schrödinger unique advantage:

- Extensive experience developing MLFF, most notably for complex battery materials (solids, liquids and interfaces)
- MLFF community is following our lead for model development (see, e.g., Bytedance AI Molecular BOOster, Csanyi & Grey)

### Relevant experience:

- Battery Project with
  Gates Ventures LLC:
  - <u>Paper</u>
  - <u>Meeting Abstract</u>
- White paper
- Internal expertise





### How to work with Schrödinger





# How to work with Schrödinger



Trust our extensive experience onboarding commercial customers:

- Dedicated science and technology support
- Professional online training courses, tutorials, and documentation
- Easy-to-use graphical interface with automated workflows (no coding required)
- No hardware? We can configure cloud resources for you



# How to work with Schrödinger



Trust our extensive experience executing research projects:

- Identify your important research questions to be addressed with simulation
- You retain the intellectual property
- No software or hardware needed
- Knowledge transfer and training available during and after the project





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