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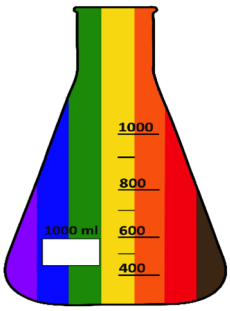
Academic free speech or right-wing grievance?

John M. Herbert*



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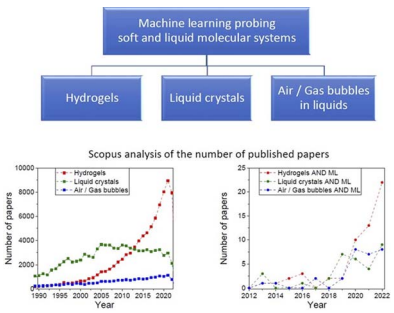

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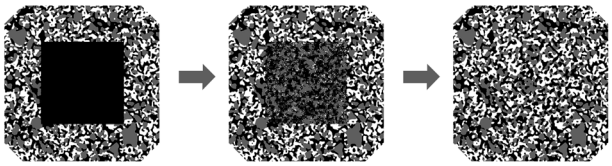
Isaac Squires,* Amir Dahari, Samuel J. Cooper and Steve Kench



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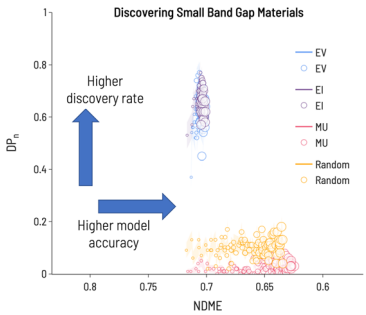

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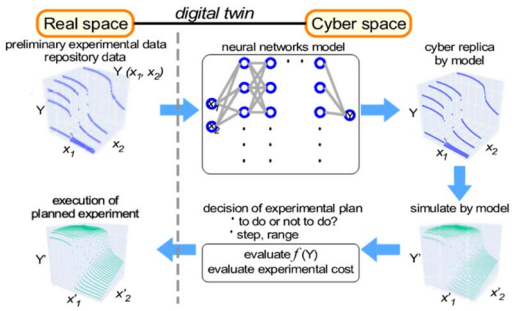

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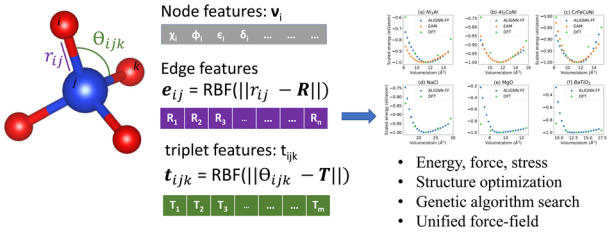

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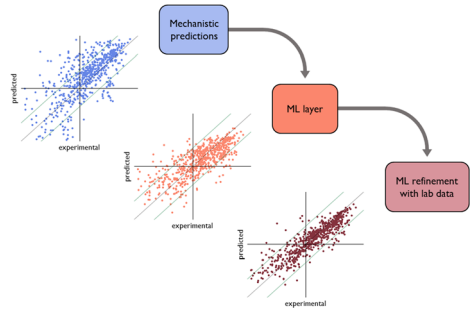

A unified ML framework for solubility prediction across organic solvents

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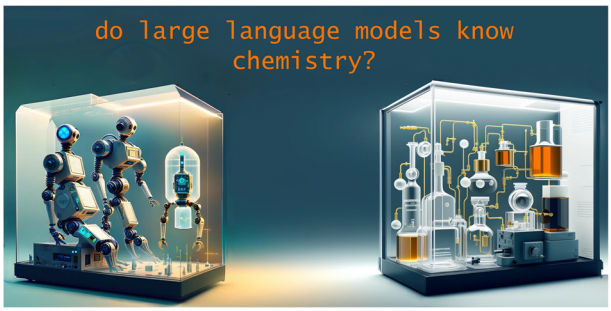

Assessment of chemistry knowledge in large language models that generate code

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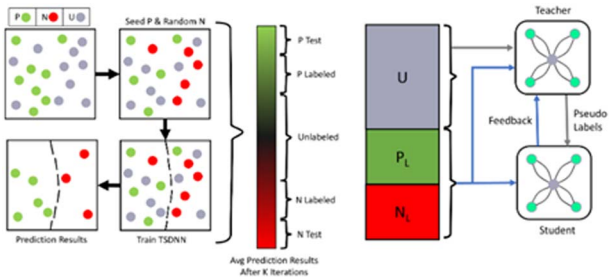

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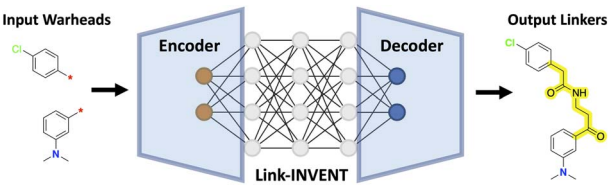

Link-INVENT: generative linker design with reinforcement learning

Jeff Guo, Franziska Knuth, Christian Margreitter, Jon Paul Janet, Kostas Papadopoulos, Ola Engkvist and Atanas Patronov*

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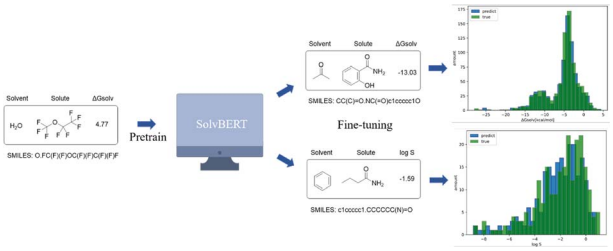

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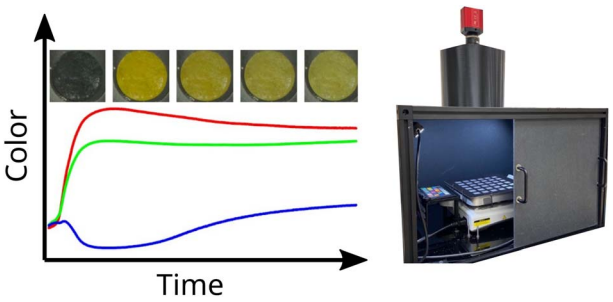

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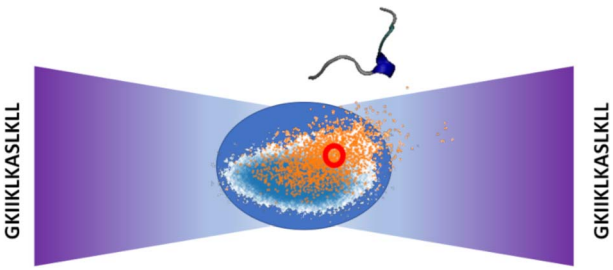

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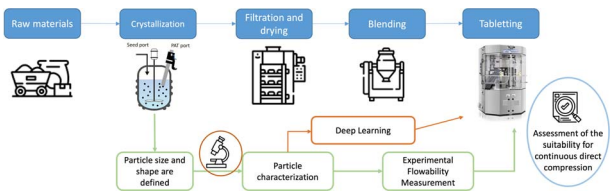

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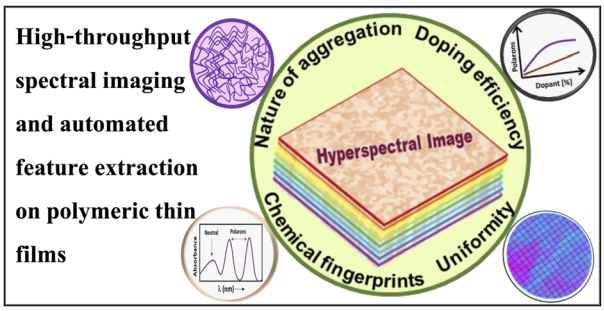

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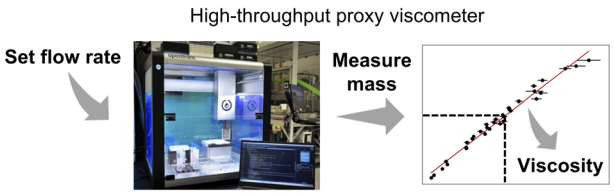

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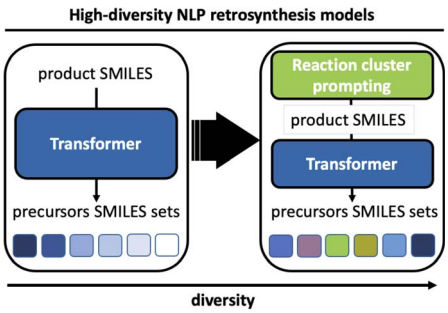

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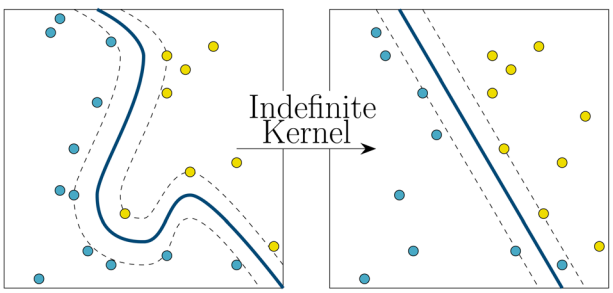

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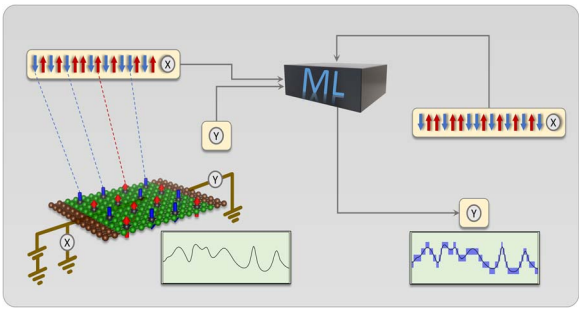
Kumar J. B. Ghosh* and Sumit Ghosh*



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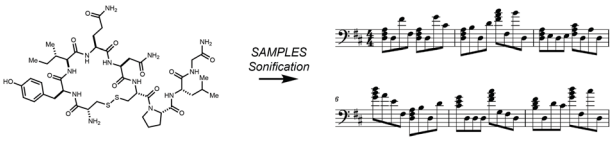

Molecular analysis, modification, and interpolation with music.

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