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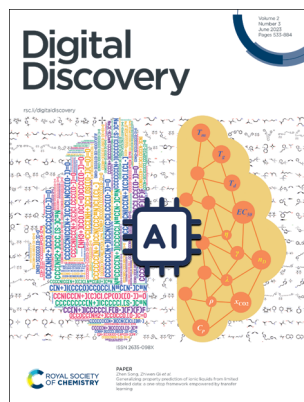
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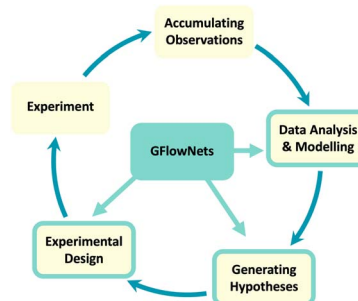
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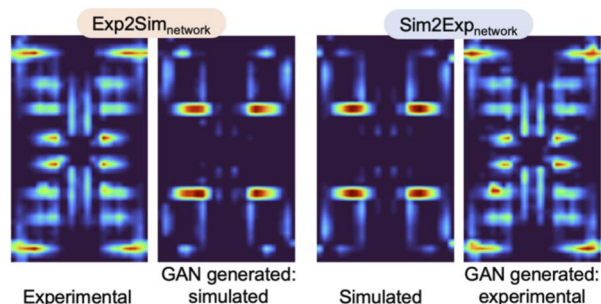
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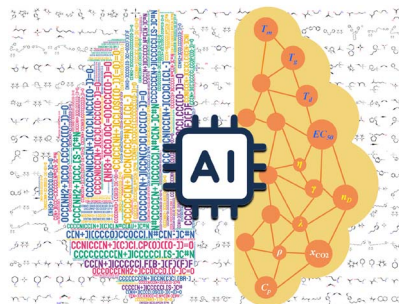
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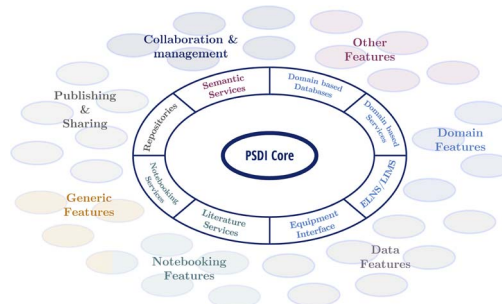
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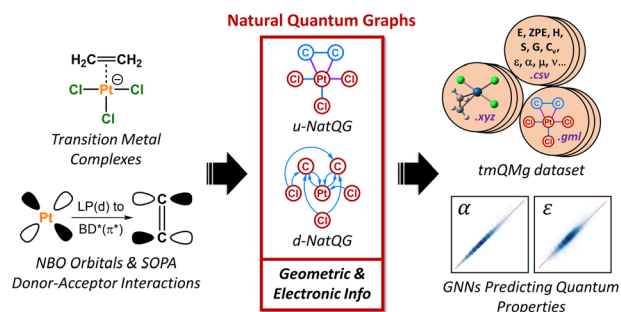
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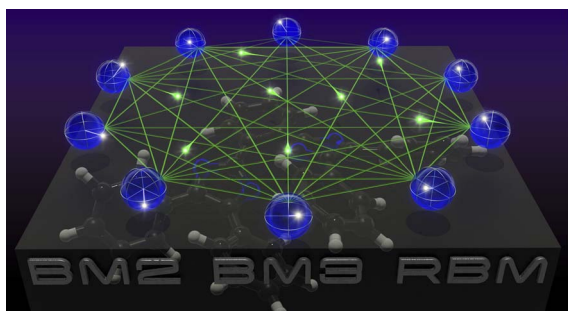
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Hannes Kneiding, Ruslan Lukin, Lucas Lang, Simen Reine, Thomas Bondo Pedersen, Riccardo De Bin and David Balcells^{*}



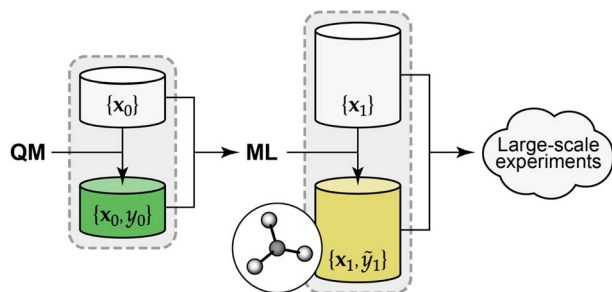
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Masaya Hagai,* Mahito Sugiyama, Koji Tsuda and Takeshi Yanai*

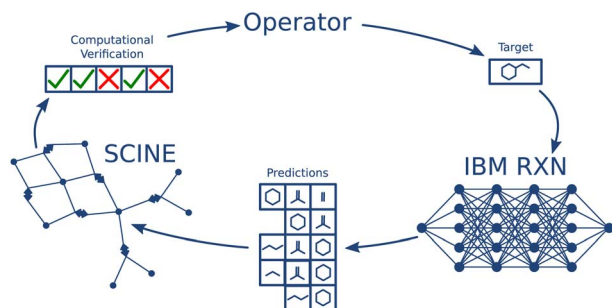
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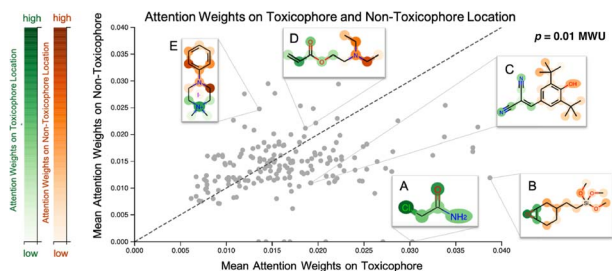
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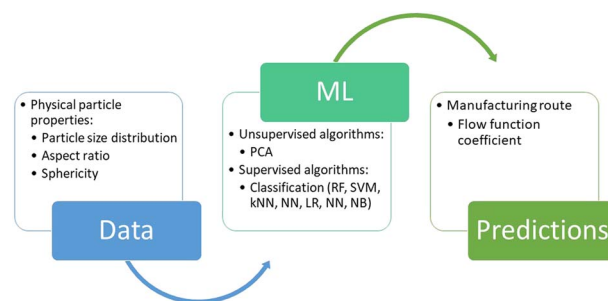
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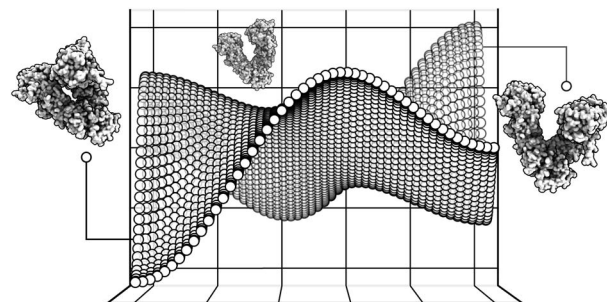
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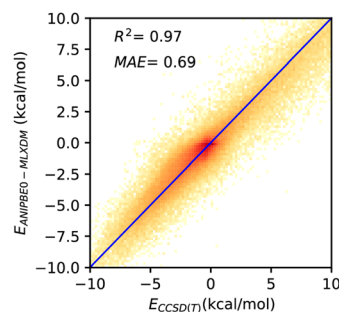
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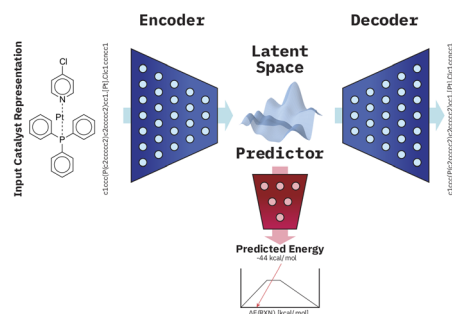
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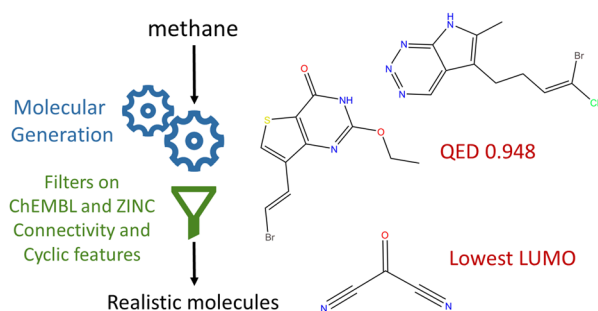
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Thomas Cauchy,^{*} Jules Leguy and Benoit Da Mota^{*}

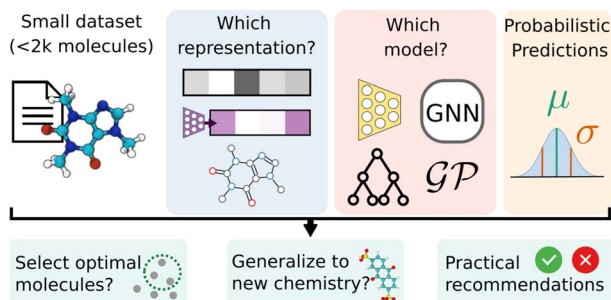
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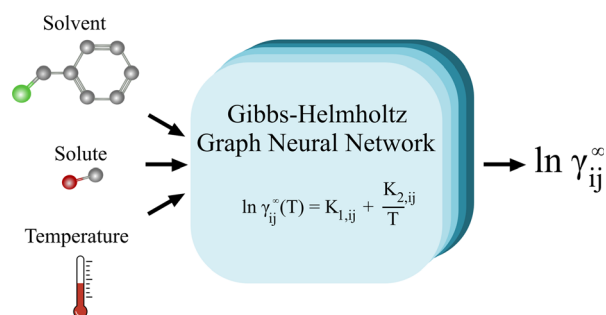
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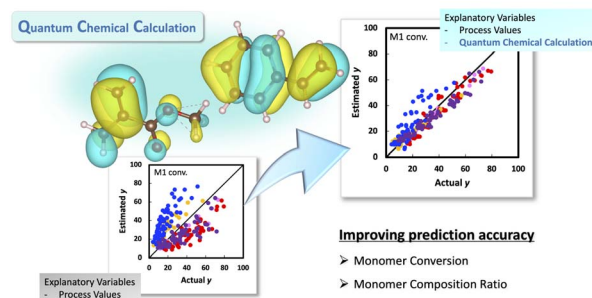
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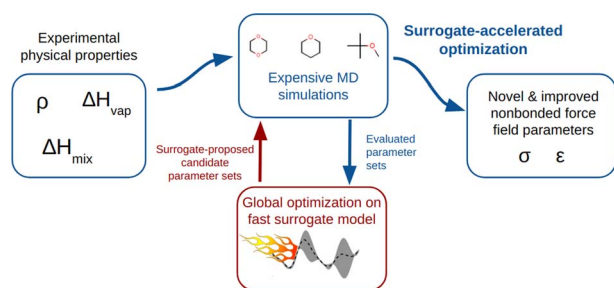
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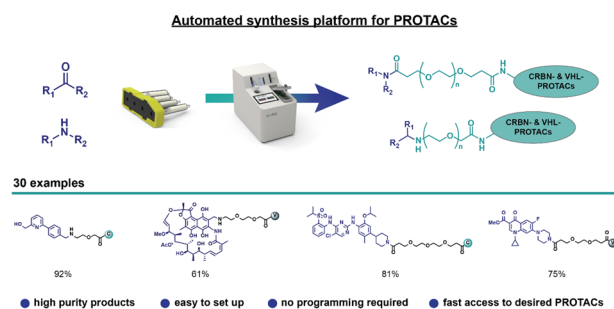
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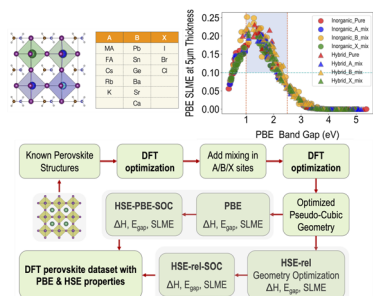
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Samuele Bordi, Tuo Jiang, Anna Konopka, Guillaume Coin, Paula L. Nichols and Benedikt M. Wanner*

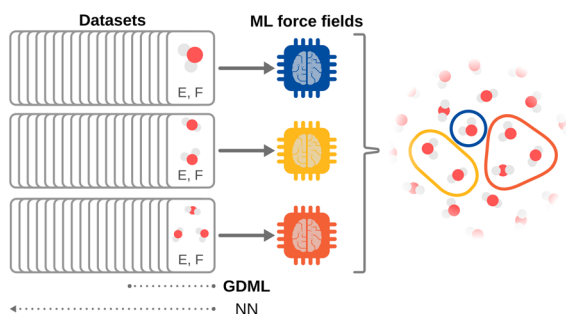
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