

# Digital Discovery

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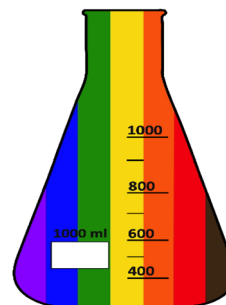
See Isaac Squires *et al.*, pp. 316–326. Image reproduced by permission of Isaac Squires and Keion Ing, *Digital Discovery*, 2023, 2, 316.

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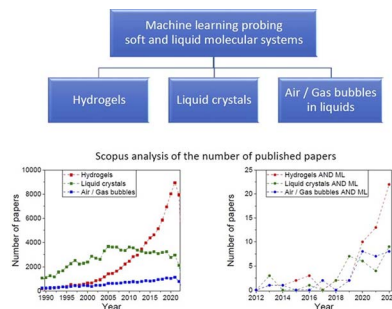


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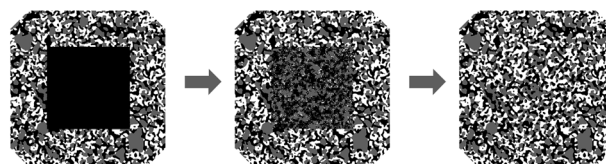
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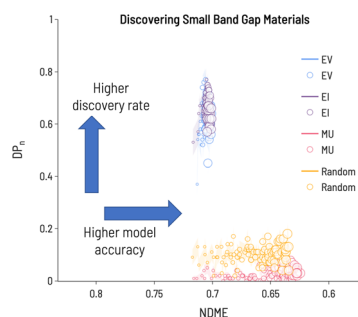
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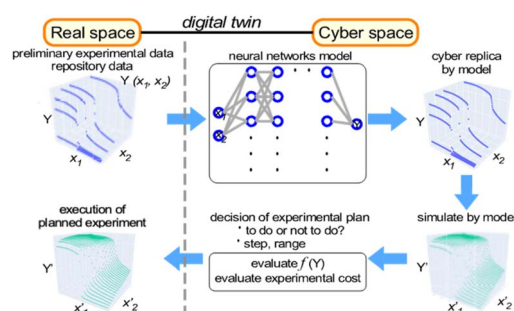
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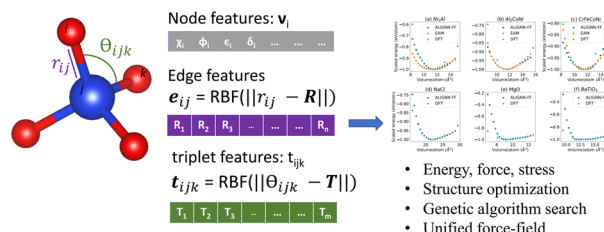
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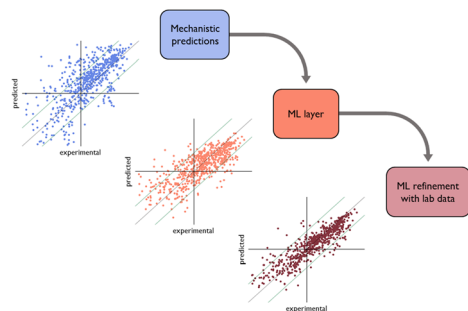
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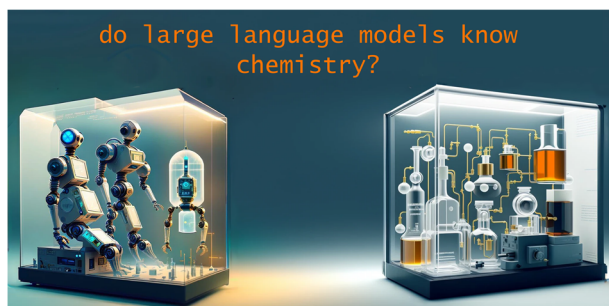
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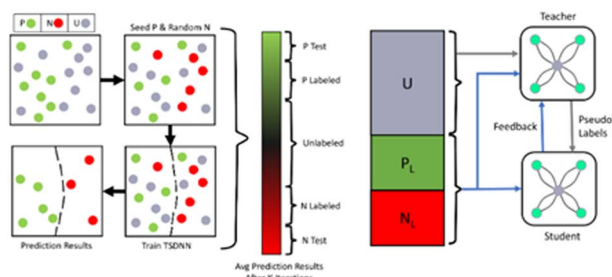
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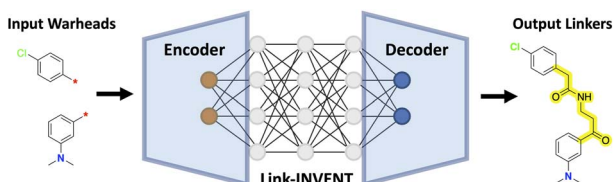
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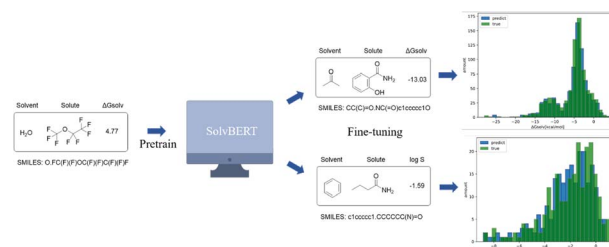


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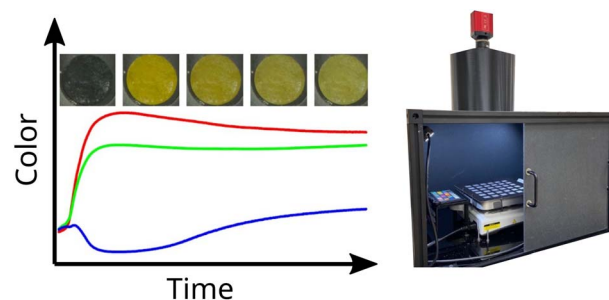
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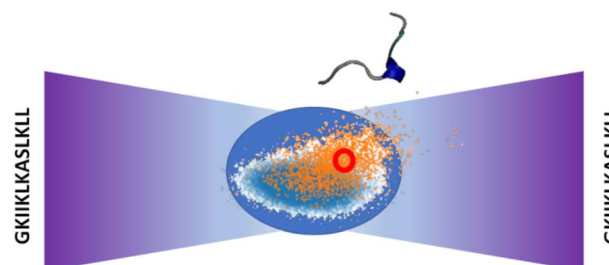
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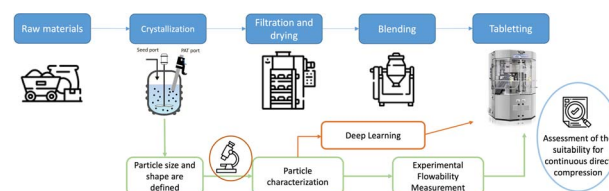
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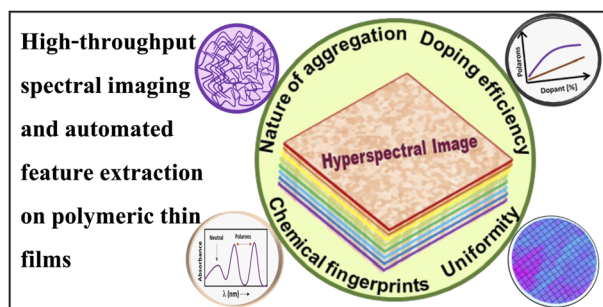
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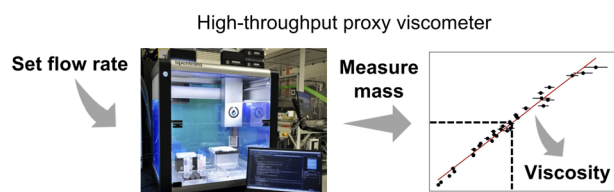
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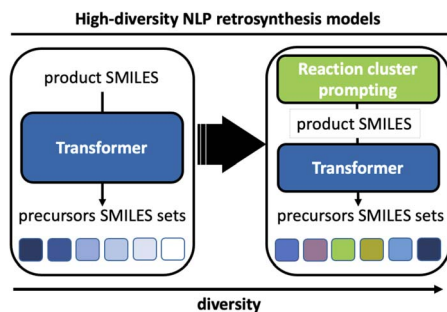
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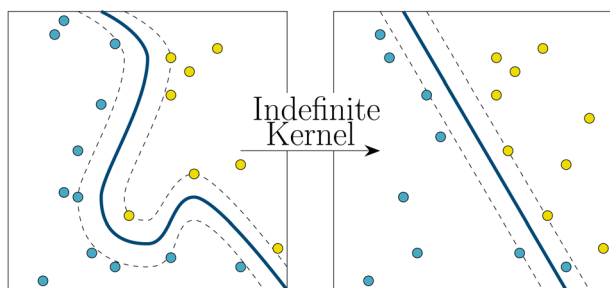
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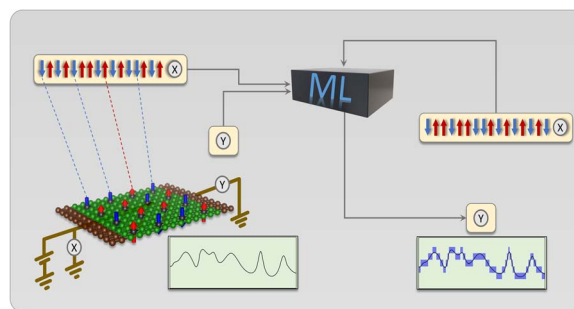




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