



Machine Learning techniques for predicting molecular properties

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Introduction

Background work

Learning Invariant Representations of Molecules for
Atomization Energy Prediction

Self-taught Learning: Transfer Learning from
Unlabeled Data

Information - Theoretic Regret Bounds for Gaussian
Process Optimization in the Bandit Setting

Conclusions



OVERVIEW

Introduction

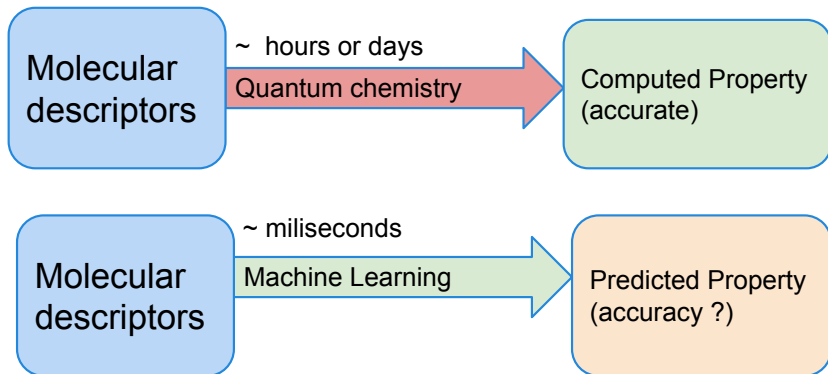
Background work

Conclusions



- ▶ Compute/predict properties of molecules for materials design
Examples: drug discovery, water purification, energy transmission and storage
- ▶ Quantum Chemistry calculations are expensive
- ▶ Machine Learning could predict properties of molecules at a fraction of the cost

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MOLECULAR DESCRIPTORS

- ▶ Desired properties of Molecular Descriptor
 - ▶ invariance to atom indexing
 - ▶ invariance to rotation and translation
- ▶ Coloumb Matrix [Rupp2012] scales $O(N^2)$

$$C(i, j) = \begin{cases} 0.5 * Z_i^{2.4} & i == j \\ Z_i * Z_j / ||R_i - R_j|| & i \neq j \end{cases} \quad (1)$$

Z_i is charge of atom i

R_i is 3D position of atom i



COLOUMB MATRIX

Coloumb Matrix descriptor

- ▶ invariant to rotation and translation (use $||R_i - R_j||$)
- ▶ invariance to atom indexing
 - ▶ Sorted Coloumb Matrix - indexes given by sorting the row norms
 - ▶ Random Coloumb Matrix - generate multiple Sorted Coloumb Matrices perturbed by noise)



RANDOM COLOUMB MATRIX

Coloumb Matrix descriptor

- ▶ Atomization energy prediction for a dataset of 7k samples (5.5k training 1.5k testing) with H,O,C,N,S Multilayer Feed Forward NN with Random Coloumb 3.1 kcal/mol MAE - chemical accuracy level 1kcal/mol



INTRODUCTION

Things in a Bulleted List

- ▶ Bullets that
- ▶ Come up
- ▶ One by one



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