## **Anubhav Jain**

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## **Summary**

I work on designing and understanding **new materials** from **computational approaches**. My major expertise is using a technique called **density functional theory** in a **high-throughput** mode to screen thousands of materials for an application. Some areas I have worked on are **Li ion batteries**, **multivalent batteries**, **thermoelectrics**, **photocatalysts**, **solar PV**, and **Hg gas adsorbers**. I am also a major developer of the **Materials Project**, develop **open-source codebases**, and work closely with **supercomputing centers**. I am also interested in applications of **machine learning** and **data mining** in materials science.

I have a blog, **www.hackingmaterials.com**, highlighting some of my research interests. I also have a Twitter feed, **twitter.com/jainpapers**, that summarizes all of my papers in 140 characters or less.

## **Education and Training**

Education and Training		
	2011 – 2013	Postdoctoral Fellow at Lawrence Berkeley National Laboratory Topic: The Materials Project Advisors: Dr. Kristin Persson & Dr. David H. Bailey
	2006 – 2011	<b>Ph.D. at Massachusetts Institute of Technology</b> Department of Materials Science & Engineering Advisor: Prof. Gerbrand Ceder
	2002 – 2006	Bachelors of Engineering at Cornell University Applied Engineering Physics Department Advisors: Prof. Alexander Gaeta and Prof. R.B. Van Dover

#### **Publications**

1. Understanding Thermoelectric Properties from High-Throughput Calculations: Trends, Insights, and Comparisons with Experiment Chen W., Pohls J.-H., Hautier G., Broberg D., Bajaj S., Aydemir U., Gibbs Z.M., Zhu H., Asta M., Snyder G.J., Meredig B., White M.A., Persson K.A., Jain A. / (submitted)

2. YCuTe2: A Member of A New Class of Thermoelectric Materials with CuTe4-Based Layered Structure

Aydemir U., Pohls J.-H., Zhu H., Hautier G., Bajaj S., Gibbs Z.M., Chen W., Li G., Ohno S., Broberg D., Kang S.D., Asta M., Ceder G., White M.A., Persson K., Jain A., Snyder G.J. / (submitted)

3. Large scale computational screening and experimental discovery of novel materials for high temperature CO<sub>2</sub> capture

Dunstan M., Jain A., Liu W., Ong S.P., Liu T., Lee J., Persson K., Scott S.A., Dennis J.S., Grey C.P./ (submitted)

4. The Energy Scale of Inorganic Crystalline Metastability

- Sun W., Dacek S., Ong S.P., Hautier G., Jain A., Richards W., Persson K.A., Ceder G. / (submitted)
- 5. New Opportunities for Materials Informatics: Resources and Data Mining Techniques for Uncovering Hidden Relationships
  Jain A., Hautier G., Ong S.P., Persson K. / (submitted) \*invited paper
- 6. Computational Predictions of Energy Materials using Density Functional Theory Jain A., Shin Y., Persson K. / Nature Reviews Materials (2015) \*invited paper
- 7. Computational and experimental investigation of TmAgTe2 and XYZ2 compounds, a new group of thermoelectric materials identified by first principles high-throughput screening
  - Zhu H., Hautier G., Aydemir U., Gibbs Z.M., Li G., Bajaj S., Pohls J.-H., Broberg D., Chen W., Jain A., Asta M., Snyder G.J., Persson K., Ceder G. / J. Mater. Chem C (2015)
- 8. Materials Design Rules for Multi-Valent Ion Mobility in Intercalation Structures Rong Z., Malik R., Canepa P., Gopalakrishnan S.G., Liu M., Jain A., Persson K.A., Ceder G. / Chemistry of Materials (2015)
- 9. Supramolecular Perylene Bisimide-Polysulfide Gel Networks as Nanostructured Redox Mediators in Dissolved Polysulfide Lithium-Sulfur Batteries
  Frischmann P.D., Gerber L.C.H., Doris S.E., Tsai E.Y., Fan F.Y., Qu X., Jain A., Persson K.A., Chiang Y-M., Helms B.A. / Chemistry of Materials (2015)
- **10. FireWorks: a Dynamic Workflow System Designed for High-Throughput Applications**Jain A., Ong S.P., Chen W., Medasani B., Qu X., Kocher M., Brafman M., Petretto G., Rignanese G.-M., Hautier G., Gunter D., Persson K.A. / Concurrency and Computation: Practice and Experience (2015)
- 11. Charting the Complete Elastic Properties of Inorganic Crystalline Compounds de Jong M., Chei W., Angsten T., Jain A., Notestine R., Gamst A., Sluiter M., Ande C., van der Zwaag S., Curtarolo S., Toher C., Plata J.J., Ceder G., Persson K., Asta M. / Nature Scientific Data (2015)
- **12.** The Electrolyte Genome Project: A Big Data Approach in Battery Materials Discovery Qu X., Jain A., Rajput N.N., Cheng L., Zhang Y., Ong S.P., Brafman M., Maginn E., Curtiss L.A., Persson K.A. / Computational Materials Science (2015)
- 13. First-principles study of electronic structure and photocatalytic properties of MnNiO3 as an alkaline oxygen-evolution photocatalyst Yu J., Yan Q., Chen W., Jain A., Neaton J., Persson K.A. / Chemical Communications (2015)
- 14. Relating Voltage and Thermal Safety in Li-ion Battery Cathodes: a High-Throughput Computational Study
  Jain A., Hautier G., Ong S., Dacek S., Ceder G. / Physical Chemistry Chemical Physics (2015)
- **15.** Accelerating Electrolyte Discovery for Energy Storage by High Throughput Screening Cheng L., Assary R.S., Qu X., Jain A., Ong S.P., Rajput N.N., Persson K.A., Curtiss L.A. / Journal of Physical Chemistry Letters (2015) \*cover article
- 16. The Materials API: A simple, flexible and efficient application programming interface (API) for materials data based on REpresentational State Transfer (REST) Principles. Ong S., Cholia S., Jain A., Brafman M., Gunter D., Ceder G., Persson K.A. / Comp. Mat. Sci (2015)
- 17. Spinel Compounds as Multivalent Battery Cathodes: A Systematic Evaluation Based on *ab initio* Calculations
  Liu M., Rong Z., Malik R., Canepa P., Jain A., Persson K.A., Ceder G. / Energy & Environmental
  - Liu M., Rong Z., Malik R., Canepa P., Jain A., Persson K.A., Ceder G. / Energy & Environmental Science (2014)
- **18.** New Light Harvesting Materials Using Accurate and Efficient Bandgap Calculations Castelli I.E., Huser F., Pandey M., Li H., Thygesen K.S., Seger B., Jain A., Persson K.A., Ceder G., Jacobsen K.W. / Advanced Energy Materials (2014) \*cover article
- 19. Commentary: The Materials Project: A Materials Genome Approach to Accelerating

#### **Materials Innovation**

Jain A.,\*\* Ong S.,\*\* Hautier G., Chen W., Richards W.D., Dacek S., Cholia S., Gunter D., Skinner D., Ceder G., Persson K.A. / Applied Physics Letters Materials (2013) \*invited paper \*one of the highest cited papers in the journal's history \*cover article \*\*equal contributions

- **20. Performance of Genetic Algorithms in Search for Water Splitting Perovskites** Jain A., Castelli I. E., Hautier G., Bailey D. H., Jacobsen K. W. / J. Materials Science (2013)
- **21. Designing Multi-Electron Lithium-Ion Phosphate Cathodes by Mixing Transition Metals** Hautier G., Jain A., Mueller T., Moore C., Ong S.P., Ceder G. / Chemistry of Materials (2013)
- **22.** Improved Capacity Retention for LiVO<sub>2</sub> by Cr Substitution
  Ma X., Hautier G., Jain A., Doe R., Ceder G. / J. Electrochemical Society (2012)
- 23. Python Materials Genomics (pymatgen): A Robust, Open-Source Python Library for Materials Analysis

Ong S.P, Richard W.D., Jain A., Hautier G., Kocher M., Cholia S., Gunter D., Chevrier V., Persson K., Ceder G. Computational Materials Science (2012)

24. From the computer to the laboratory: materials discovery and design using first-principles calculations

Hautier G., Jain A., Ong S. / Journal of Materials Research (2012) \*invited paper

25. Carbonophosphates: a new family of cathode materials for Li ion batteries identified computationally

Chen, H. Hautier G., Jain A., Moore C., Kang B., Doe R., Wu L., Zhu Y., Tang Y., Ceder G. / Chemistry of Materials (2012)

**26.** Accuracy of density functional theory in predicting formation energies of ternary oxides from binary oxides and its implication on phase stability
Hautier G., Ong S.P., Jain A., Moore C., Ceder G. / Physical Review B (2012)

27. A Computational Investigation of Li<sub>9</sub>M<sub>3</sub>(P<sub>2</sub>O<sub>7</sub>)<sub>3</sub>(PO<sub>4</sub>)<sub>2</sub> (M=V,Mo) as Cathodes for Li Ion Batteries

Jain A., Hautier G., Moore C., Kang B., Lee J., Chen H., Twu N., Ceder G. / J Electrochem Soc. (2011)

28. Novel mixed polyanions lithium-ion battery cathode materials predicted by highthroughput ab initio computations

Hautier G., Jain A., Chen H., Moore C., Ong S.P., Ceder G. / Journal of Materials Chemistry (2011)

29. Evaluation of Tavorite-Structured Cathode Materials for Lithium-Ion Batteries Using High-Throughput Computing

Mueller T., Hautier G., Jain A., Ceder G. / Chemistry of Materials (2011)

30. Voltage, Stability and Diffusion Barrier Differences between Sodium-ion and Lithium-ion Intercalation Materials

Ong S.P., Chevrier V.L., Hautier G., Jain A., Moore C.J., Kim S., Ma X., Ceder G. / Energy & Env. Sci. (2011)

31. Phosphates as Lithium-Ion Battery Cathodes: An Evaluation Based on High-Throughput *Ab Initio* Calculations

Hautier G., Jain A., Ong S.P., Kang B.W., Moore C., Doe R., Ceder G / Chemistry of Materials (2011)

32. Recharging Lithium Battery Research with Ab Initio Methods

Ceder G., Hautier G., Jain, A., Ong S.P. / MRS Bulletin (2011) \*invited paper \*\*top 10 downloaded MRS 2011

33. Formation Enthalpies by Mixing GGA and GGA+U calculations

Jain A., Hautier G., Ong S.P., Moore C., Fischer C.C., Persson K., Ceder G. / Phys. Rev B (2011)

**34.** A High-Throughput Infrastructure for Density Functional Theory Calculations
Jain A., Hautier G., Moore C., Ong S.P., Fischer C.C., Persson K., Ceder G. / Comp. Mat. Sci. (2011) \*one of the highest cited papers in the journal's history

# 35. Synthesis and Electrochemical Properties of Monoclinic LiMnBO<sub>3</sub> as a Li Intercalation Material

Kim J.C., Moore C.J., Kang B., Hautier G., Jain A., Ceder G. / Journal of the Electrochemical Society (2011)

36. Data-mined Ionic Substitution for New Compound Discovery

Hautier G., Fischer C.C., Erlacher V., Jain A., Ceder G. / Inorganic Chemistry (2011)

37. Finding Nature's Missing Ternary Oxide Compounds Using Machine Learning and Density Functional Theory

Hautier G., Fischer C.C., Jain A., Mueller T., Ceder G. / Chemistry of Materials (2010)

38. Thermal Stabilities of Delithiated Olivine MPO<sub>4</sub> (M=Fe,Mn) Cathodes Investigated using First Principles Calculations

Ong S.P., Jain A., Hautier G., Kang B., Ceder G. / Electrochemistry Communications (2010)

39. Ab Initio Screening of Metal Sorbents for Elemental Mercury Capture in Syngas Streams

Jain A., Seyed-Reihani S.A., Fischer C.C., Couling D.J., Ceder G., Green W.H. / Chem. Eng. Sci. (2010)

40. Are you Centered? An Automatic Crystal-Centering Method for High-Throughput Macromolecular Crystallography

Jain A., Stojanoff V. / Journal of Synchrotron Radiation (2007)

**41.** A Modular Approach to Beam Line Automation: the NIGMS Facility at the NSLS Allaire M., Berntson A., Jain A., Jakoncic J., Kao C.C., Siddons D.R., So I., Venkatagiriyappa V., Yin Z., Stojanoff V. / Synchrotron Radiation News (2005)

## **Conference Proceedings**

1. Computational methods for evaluating potential sorbent-based synthesis gas cleanup technologies

Couling D., Kshitij P., Jain A., Seyed-Reihani S.A., Das U., Ceder G., Green W.H. / Proceedings of International Pittsburgh Coal Conference (2009) 65 (18), 5295-5295

2. Community Accessible Datastore of High-Throughput Calculations: Experiences from the Materials Project

Gunter D., Cholia Ś., Jain A., Kocher M., Pesson K., Ramakrishnan L., Ong S., Ceder G. / Fifth Workshop on Many-Task Computing on Grids and Supercomputers, Supercomputing (2012)

3. A community contribution framework for sharing materials data with Materials Project

Huck, P, Jain A., Gunter D., Winston D., Persson K. / IEEE 11th International Conference on eScience (2015)

#### **Patents**

1. Tavorite Structured Cathode Materials for Li-Ion Batteries

Mueller T., Hautier G., Ceder G., Jain A. (utility patent filed August 2012)

2. Mixed Phosphate-Diphosphate Electrode Materials and Methods of Manufacturing Same

Ceder G., Jain A., Hautier G., Daniel R., Kim J.C., Kang B. US Patent 9159991, International Patent WO 2012/024001

3. Carbonophosphate and Related Compounds

Ceder G., Chen H., Hauter G., Kang B., Jain A., Doe R. (provisional patent filed February 2010, utility patent filed Feb 2011/issued in 2015)

4. Design of Multi-Electron Li-ion Phosphate Cathodes by Mixing Transition Metals

Hautier G., Jain A., Mueller T., Ceder G. (provisional patent filed January 2013, PCT filed Jan 2014)

#### 10 Selected Presentations

1. New Energy Storage and Energy Generation Materials from First-Principles Calculations

DREAMS workshop, May 2015, Halifax, Nova Scotia, CA (invited talk)

2. The Materials Project: An Electronic Structure Database and its Application to Materials Informatics

Materials Research Society, December 2014, Boston MA (invited talk)

3. The Materials Project: An Electronic Structure Database for Community-Based Materials Design

ICAMM, July 2014, Nantes France (invited talk)

4. The Materials Project: Computing and Sharing a Searchable Database of Materials Properties Using the FireWorks Job Management System

Joint Facilities User Forum on Data-Intensive Computing, June 2014, Oakland CA (invited talk)

**5. DFT and Materials Informatics: Finding the "needle in the haystack"** CAMD Summer School, August 2012, *Lyngby Denmark (invited talk)* 

6. Is it Possible to Design Safe, High-Voltage Cathodes? An Investigation with High-Throughput Computing

Electrochemical Society, May 2012, Seattle WA

7. Investigation of Li<sub>9</sub>V<sub>3</sub>(P<sub>2</sub>O<sub>7</sub>)<sub>3</sub>(PO<sub>4</sub>)<sub>2</sub> as a Li Intercalation Cathode with DFT Computations

Materials Research Society, April 2012, San Francisco CA

8. The Materials Genome Project: Using High-Throughput Computing to Design New Materials for Clean Energy

CECAM, May 2011, Lausanne Switzerland (invited talk)

9. High-Throughput Materials Design: DFT Calculations on All Reported Crystal Structures And Beyond

CECAM, April 2010, Lausanne Switzerland (invited talk)

**10. Screening of Sorbents for Mercury Capture Using Ab Initio Computations** American Institute for Chemical Engineers, April 2009, *Tampa FL* 

## **Major awards**

- DOE Early Career Award (2015)
- NERSC Achievement Award: Innovative Use of High-Performance Computing
- Luis W. Alvarez Postdoctoral Fellowship
- DOE Computational Science Graduate Fellowship
- John McMullen Scholarship

#### **Professional Activities**

- develop and maintain open-source software for running high-throughput calculations at supercomputing centers (FireWorks)
- contribute to several open-source software packages, including pymatgen and MPWorks
- Vice President of NERSC User Group Executive Committee (supercomputing center)
- leader of committee to develop solutions to more efficiently structure queueing policies

at the NERSC supercomputing center

- referee for multiple journals (Physical Review B, Journal of the Electrochemical Society, Anaalen der Physik, and others) and part of several review panels
- member of judging panel, first materials "hackathon" at Materials Research Society Fall 2014
- maintain a blog on computational materials science (www.hackingmaterials.com)
- maintain a Twitter feed summarizing all my papers (twitter.com/jainpapers)

### **Personal interests**

My hobbies and interests include photography, electronic music composition, and doodles that often end up on my presentation slides; more information is at my personal web site (http://www.anubhavjain.net).