# Managing Research



# Outline

How to...

- Come up with research ideas
- Choose research topic
- MSc vs PhD
- Stay updated with new research
- Read papers efficiently
- Work with your supervisors
- Decide to start writing
- Connect with your research community



# How to come up with research ideas?

<u>Subjective</u> thoughts for this point in time

- 1. Narrow down
- 2. Specialize
- **3**. Document into your tool-box
- 4. Read more broadly
- 5. Find a new idea



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- 2. Is it **feasible**?





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If you do not work on an important problem, it's unlikely you'll do important work. It's perfectly obvious. Richart Hamming, "<u>You and Your Research</u>"

How to know what's important? Listen to leading researchers talks

### The Biggest Open Problems in NLP



Sebastian Ruder



Jade Abbott



Stephan Gouws



Omoju Miller



Bernardt Duvenhage



Sebastian Ruder's session link, Jason Baldridge's talk, Thomas Wolf's talk

Be aware of red & blue oceans

• "Blue Ocean" problems are safe, in "Red Ocean" problems you have more competition





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#### Read a lot about your topic

With a bachelor's degree, you gain a specialty:

A master's degree deepens that specialty:

https://matt.might.net/articles/phd-school-in-pictures/

Read a lot about your topic

Reading research papers takes you to the edge of human knowledge:



Once you're at the boundary, you focus:



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# Detour - PhD vs. MSc

	MSc	PhD
Time	2 years	4 years
Focus	Implementation (?) Single project <b>How</b> to research	Innovation Multiple projects <b>What</b> to research
Projects risks	Preferably low risk	It's ok to have high risk
Who to work with?	Mainly your advisor	Grow your network of collaborators, go to internships, etc
Extra requirements	~24 Points in courses Overhead of starting research	~12 points in courses
Future Work	Machine Learning Engineer, Research Engineer, Research Scientist	Academia (very competitive), Industry Research Labs



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  - Track new citations
  - Skim new papers, add to "papers pool" if interesting
  - *Do it fast.* Distinguish exploration time and times working on current projects

#### 6 New Citations for Papers You Follow Inbox ×

Semantic Scholar <do-not-reply@semanticscholar.org> Unsubscribe 11:35 PM (3 minutes ago) to me 👻

#### New Papers Matching Multiple Alerts

Cites LXMERT: Learning Cross-Modality Encoder Representations from Transformers • Cites GQA: A New Dataset for Real-World Visual Reasoning and Compositional Question Answering

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Jie Gao, Hella-Franziska Hoffmann, ... Anil Bandhakavi

This paper describes our participant system for the multi-modal fact verification (Factify)

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- 4. Each conference (NAACL, ACL, EMNLP), read (**or watch**!) the papers most related to your work (< 10)

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"A paper is not a random collection of some experiments you ran that you report on. The paper sells a single thing that was not obvious or present before.", Andrej Karpathy <sup>1</sup>

<sup>1</sup> Andrej Karpathy (Director of AI in Tesla, previously OpenAI, CS231n, PhD @ Stanford): A Survival Guide to a PhD

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- What is the problem this paper deals with?
- What is the main idea of the method they use?
- What are their main findings? (Not results)
  - Can you relate their work to your project? How?

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- 1. Figure 1



Figure 1: An example of gender bias in machine translation from English (top) to Spanish (bottom). In the English source sentence, the nurse's gender is unknown, while the coreference link with "her" identifies the "doctor" as a female. On the other hand, the Spanish target sentence uses morphological features for gender: "*el* doctor" (male), versus "*la* enfermer*a*" (female). Aligning between source and target sentences reveals that a stereotypical assignment of gender roles changed the meaning of the translated sentence by changing the doctor's gender.

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- 1. Figure 1
- 2. Other figures if informative enough



Figure 2: Google Translate's performance on gender translation on our tested languages. The performance on the stereotypical portion of WinoMT is consistently better than that on the non-stereotypical portion. The other MT systems we tested display similar trends.

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- 3. Abstract

#### Abstract

We present the first challenge set and evaluation protocol for the analysis of gender bias in machine translation (MT). Our approach uses two recent coreference resolution datasets composed of English sentences which cast participants into non-stereotypical gender roles (e.g., "The doctor asked the nurse to help *her* in the operation"). We devise an automatic gender bias evaluation method for eight target languages with grammatical gender, based on morphological analysis (e.g., the use of female inflection for the word "doctor"). Our analyses show that four popular industrial MT systems and two recent state-of-the-art academic MT models are significantly prone to genderbiased translation errors for all tested target languages. Our data and code are publicly available at shorturl.at/dimuD.

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- 4. Introduction "In this paper" part

#### 1 Introduction

Learned models exhibit social bias when their training data encode stereotypes not relevant for the task, but the correlations are picked up anyway. Notable examples include gender biases in visual SRL (cooking is stereotypically done by women, construction workers are stereotypically men; Zhao et al., 2017), lexical semantics ("man is to computer programmer as woman is to homemaker"; Bolukbasi et al., 2016), and natural language inference (associating women with gossiping and men with guitars; Rudinger et al., 2017).

In this work, we conduct the first large-scale multilingual evaluation of gender-bias in machine translation (MT), following recent small-scale qualitative studies which observed that online MT services, such as Google Translate or Microsoft Translator, also exhibit biases, e.g., translating nurses as females and programmers as males, regardless of context (Alvarez-Melis and Jaakkola, 2017; Font and Costa-Jussà, 2019). Google Trans-

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- 5. Contributions
- 6. Result tables

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### **Document into your toolbox**

TLDR stuff that you may want to use in the future

- 1. It should be *searchable*
- 2. The more probability you'll use it the longer it should be

NAACL 21: Measuring Social <mark>Bias</mark>es in Grounded Vision and Language Embeddings. https://www.aclweb.org/anthology/2021.naaclmain.78.pdf.

bias

0/33

TLDR: Measuring social biases in V+L word embeddings.

Contributions:

1. Adapting WEAT and SEAT metrics to V+L, ("Grounded" versions).

2. A new dataset for testing biases in grounded systems (a small collection of men/women V+L pairs with stereotypes).

3. Findings ->.

Findings about social bias:

- 1. Grounded word embeddings have social biases.
- 2. Grounded evidence has little impact on social biases. (In other words currently the image doesn't assist enough overcoming the bias).
- 3. Biases mostly comes from the language modality.
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- 3. Follow important trends in the field

# NeurIPS 2021—10 papers you shouldn't miss

2334 papers, 60 workshops, 8 keynote speakers, 15k+ attendees. A dense landscape that's hard to navigate without a good guide and map, so here are some of our ideas!

Top NLP Trends and Predictions 2022: is NeuralSpace set up for the future of NLP?







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- From Jia-Bin Haung:
  - Find a different dimension, Ex: Text / audio / image / video / graph
  - Combine two ideas/problems
  - Add an adjective





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- Repeating (weekly?) meetings
- The meetings are for you <sup>2</sup>
  - It's not a test. Receive feedback.
  - Leshem: If you don't need / not ready for the meeting cancel it
  - Gabi: Never cancel a meeting

<sup>1</sup> Cal Newport <sup>2</sup> Leshem Choshen

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- Try their suggestions (all of them)



# **Planning Research Tips**





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  - **Results table** with mock results





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- Leave the *Introduction* for last







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- Seek criticism and be open



# **Connect with your research community**


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"If I have seen further, it is by standing on the shoulders of giants." – Isaac Newton

<sup>1</sup> Gabriel Stanovsky

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"The idea is like grass. It craves light, likes crowds, thrives on crossbreeding, grows better for being stepped on." – Ursula K. Le Guin

<sup>1</sup> Gabriel Stanovsky



Himan Abdollahpouri @himan\_abd

Best advice I ever received from one of my professors 5 years ago:

And MSc

"The output of your PhD is not your thesis. The output is YOU" #Phd



Take a look on Ronen Tamari's <u>"Dark Research" talk</u>:

...

