



Data Science

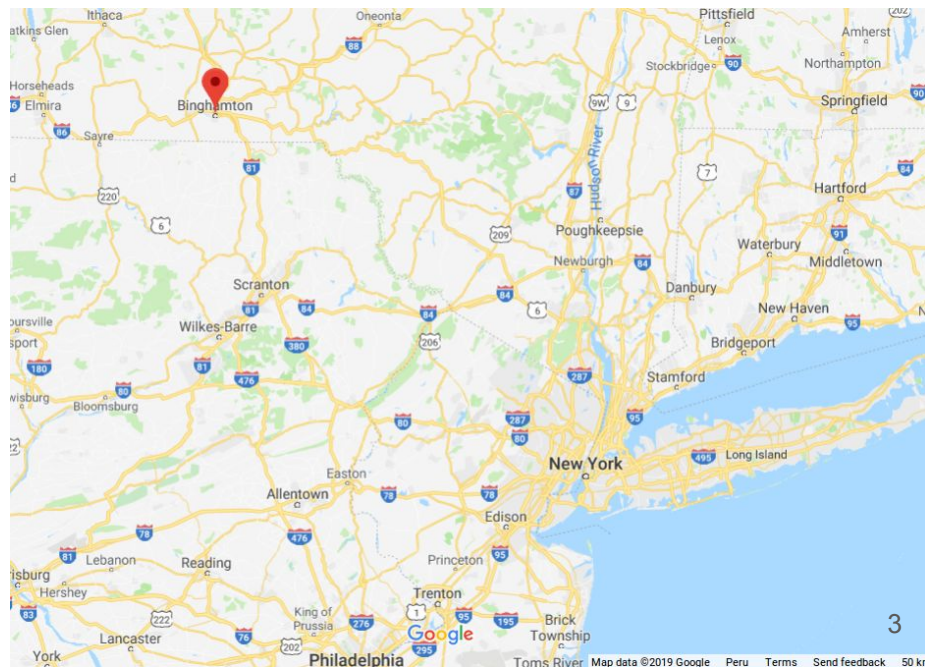
WWW.DATASCIENCE.PE

Estado de la investigación en Inteligencia Artificial

Gissella Bejarano
PhD student Binghamton University

Acerca de mí

- Pregrado: Ingeniería Informática PUCP
- Maestría en Ciencias de la Computación
 - Binghamton University (SUNY)
 - Becada de Fulbright
 - Grace Hopper Celebration
 - LxMLS
- Estudiante de doctorado



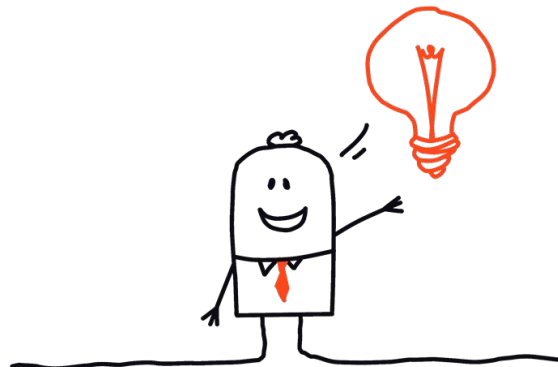
Mi experiencia

- Experiencia académica:
 - IAPUCP
 - Multimedia Research Lab
 - Machine Learning Research Group
- Experiencia profesional:
 - Belcorp, Ericsson
 - Socosoft, BCP
 - RIMAC (jun-agosto 2019)



Agenda

- PhD yo?
 - Innovación y Desarrollo
- Deep Learning y los datos no estructurados
 - Diferencias entre IA, ML y DL
 - Lenguaje Natural (NLP)
 - Visión Computacional (Computer Vision)
 - Señales
- Explosión de Machine Learning (slides de Ian Goodfellow - AAAI19)
- Ética y bias en IA
 - Interpretabilidad y explicatividad



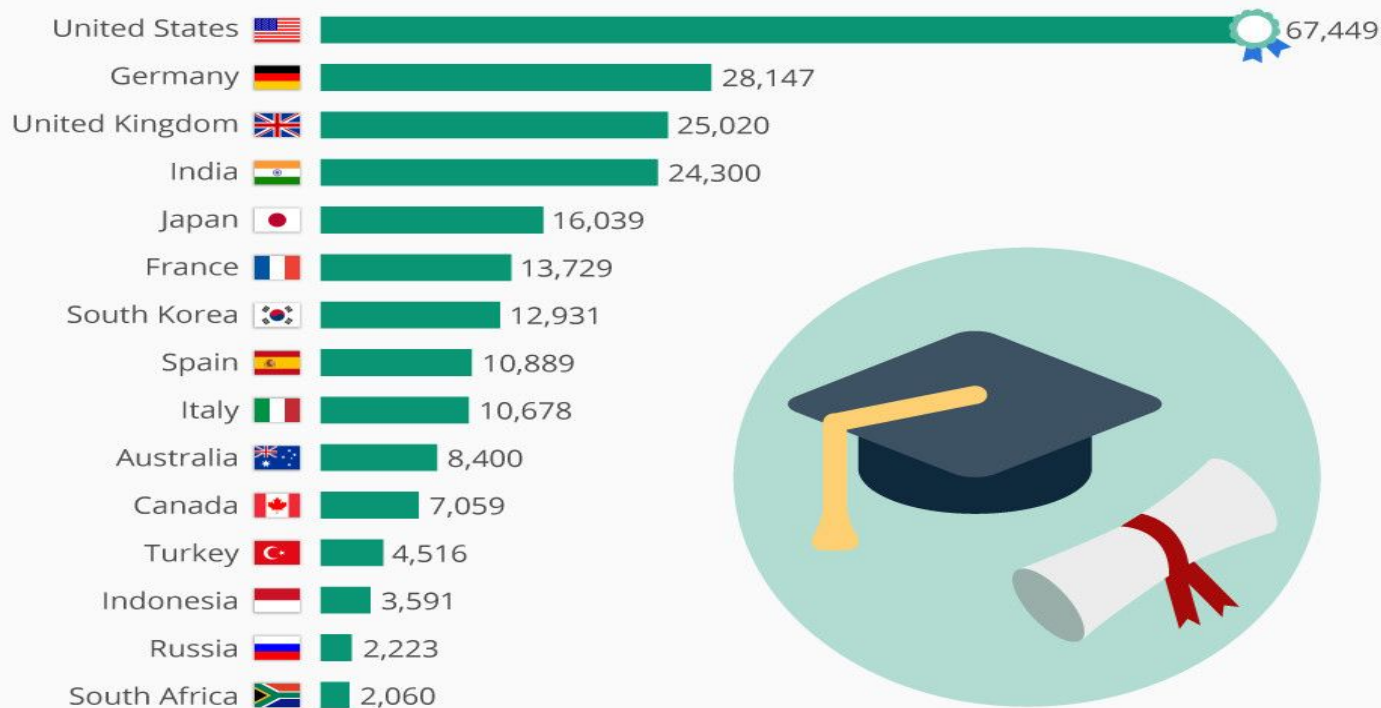
PhD yo?

- ¿Cuántos doctores hay en Perú?
 - Perú: ~4,000
 - Chile, Argentina, España: ~ 17,000 a 50,000
- ¿Cuántos doctores en Computer Science?
- ¿Se necesita un doctorado para hacer investigación/innovación?
- Llamados especialmente a la investigación y docencia.
- ¿Dónde? Industria, Academia



The Countries With The Most Doctoral Graduates

Number of doctoral graduates (all fields) in 2014

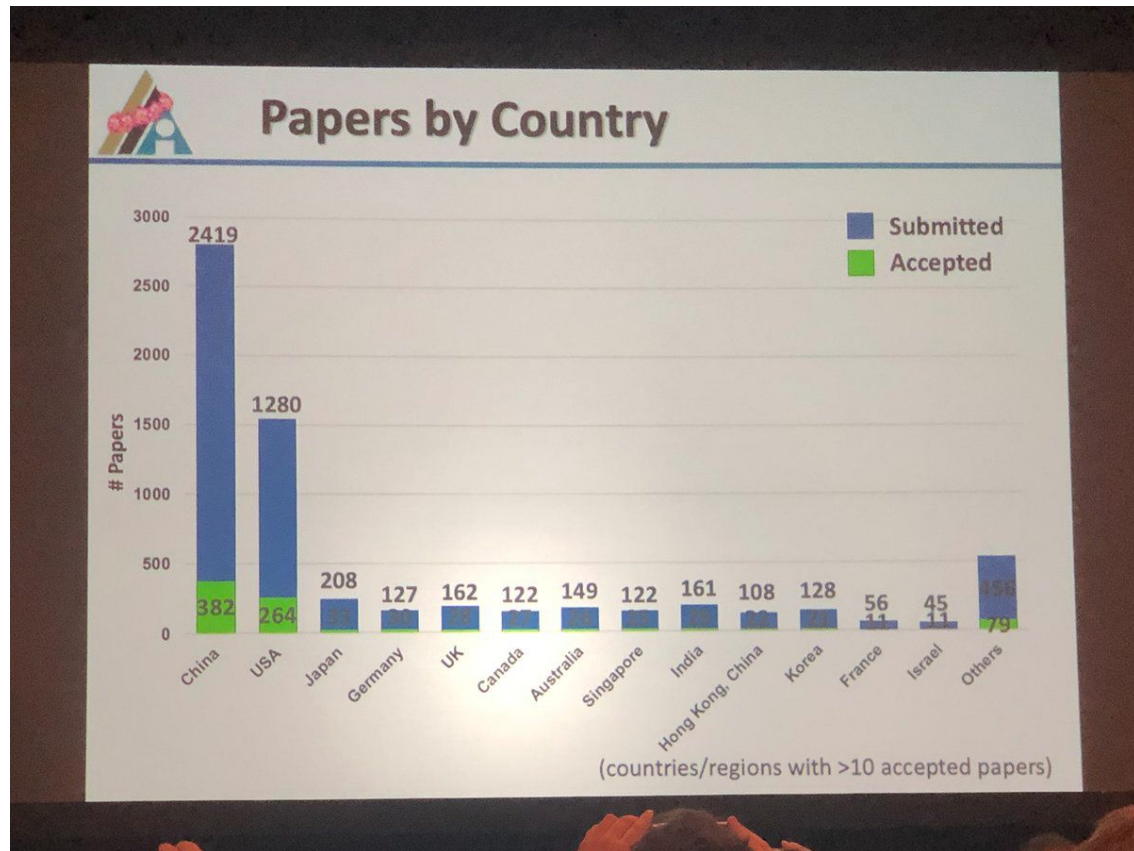


@StatistaCharts Source: OECD

statista

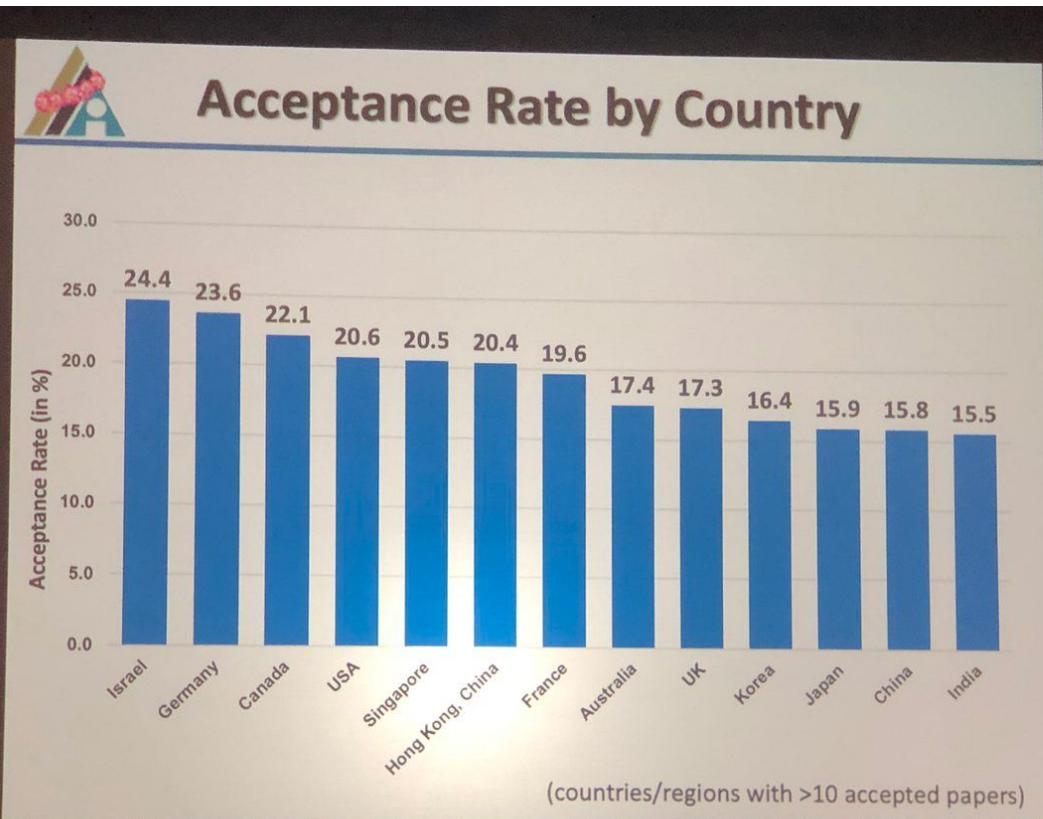
Conferencias en IA

- ¿Qué % de papers proviene de Latinoamérica?
- Top: China, USA, Japón
Alemania, Reino Unido
Canadá, ... , India, Israel



Conferencias en IA

- Ratio de aceptación por país:
 - Israel
 - Alemania
 - Canadá
 - USA
 - ...
 - China
 - India

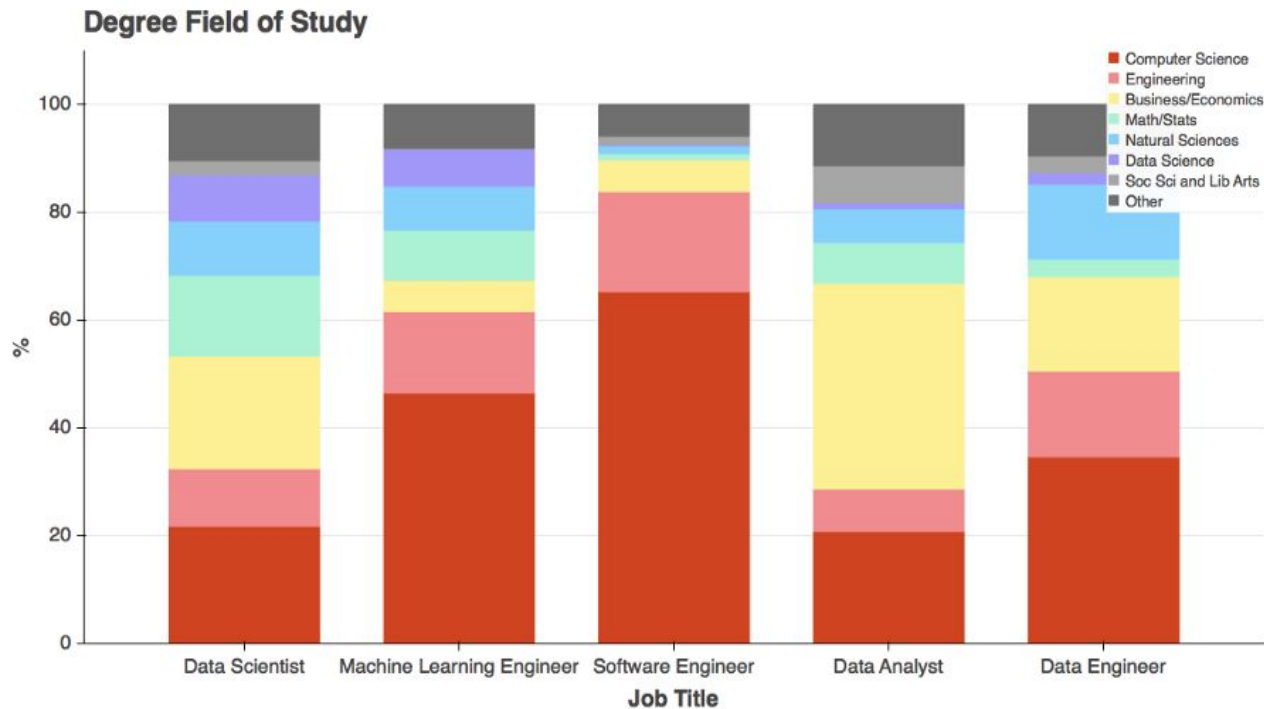


Source: The Thirty-Third AAAI Conference on Artificial Intelligence (AAAI 2019) -

[@DrXingyuZhao](#)

¿De dónde vienen los Data Scientist?

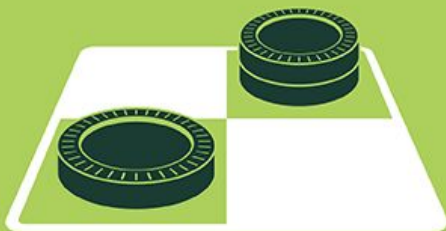
- Datos estructurados
 - Prospección
 - Financieros
- Datos No estructurados
 - Texto
 - Sonido
 - Imágenes
 - Señales



Deep Learning y los datos no estructurados

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's

1960's

1970's

1980's

1990's

2000's

2010's

Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then deep learning, a subset of machine learning – have created ever larger disruptions.

Lenguaje Natural - Tareas

- Traducción a máquina (Machine Translation)
- Question/Answering
- Summarization
- Paraphrasing
- Generación de diálogo

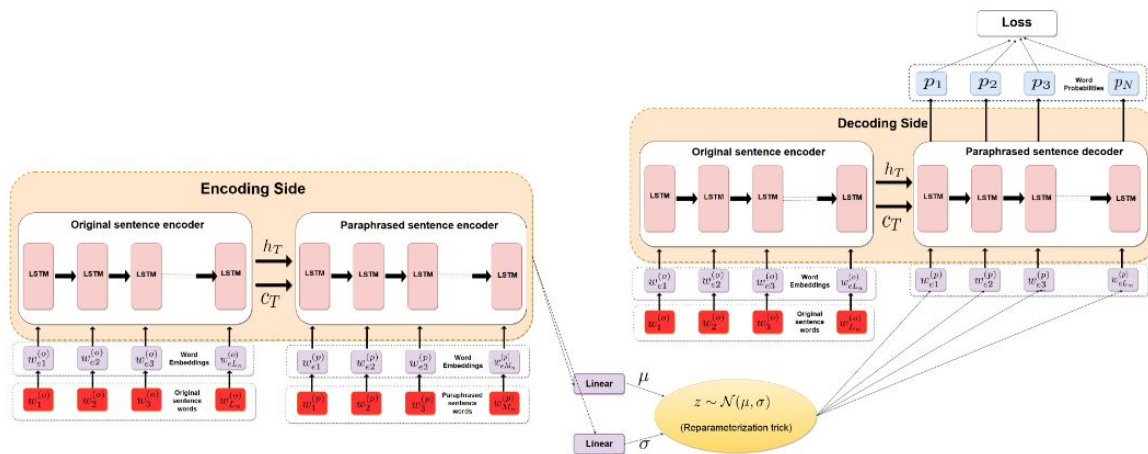
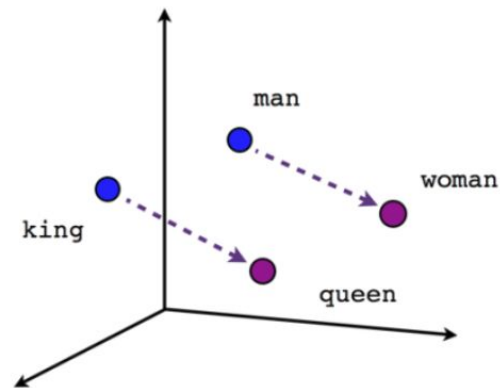


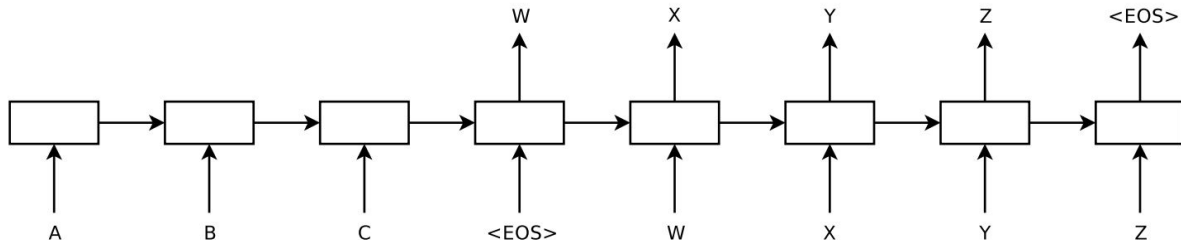
Figure 2: The block diagram of our VAE-LSTM architecture for paraphrase generation

Language Natural - Modelos

- Word Embeddings
 - Glove
 - Fast
 - Elmo
- Generación de texto
 - Transformers, Bert, GPT2
 - Odelos Sequence2sequence



Male-Female

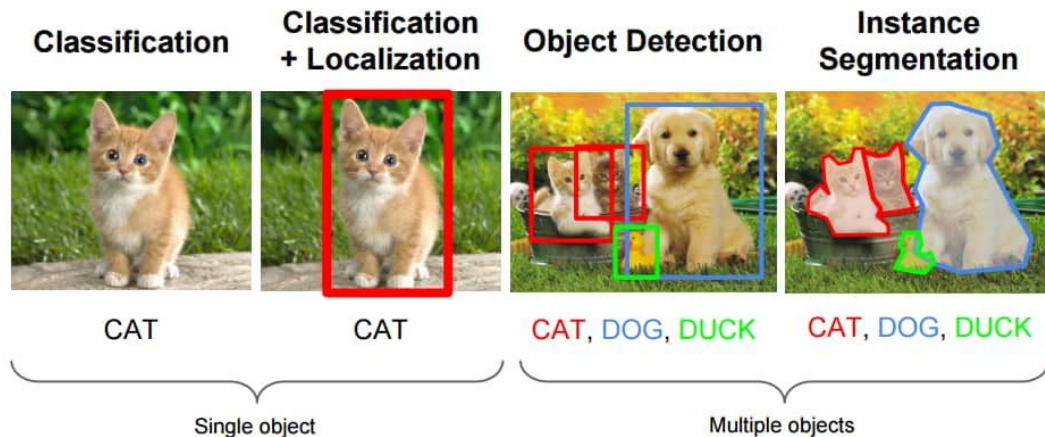


Imágenes

- Reconocimiento de objetos
- Segmentación
- Captioning (leyenda/título)
- Detección de acciones

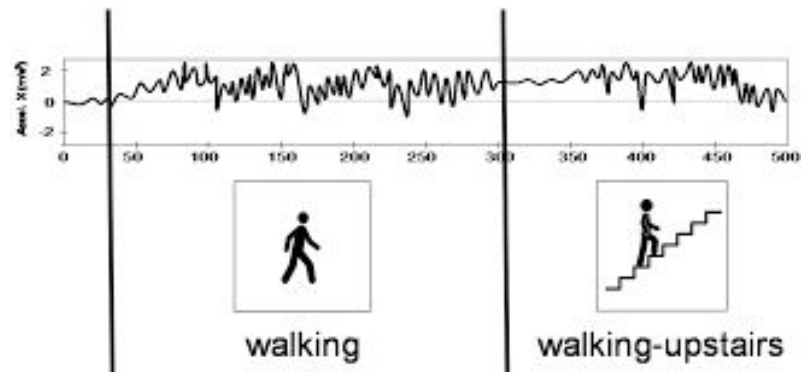


Source. Ran Xu, Priyanshu Agarwal, Suren Kumar, Venkat N. Krovi, and Jason J. Corso Combining Skeletal Pose with Local Motion for Human Activity Recognition



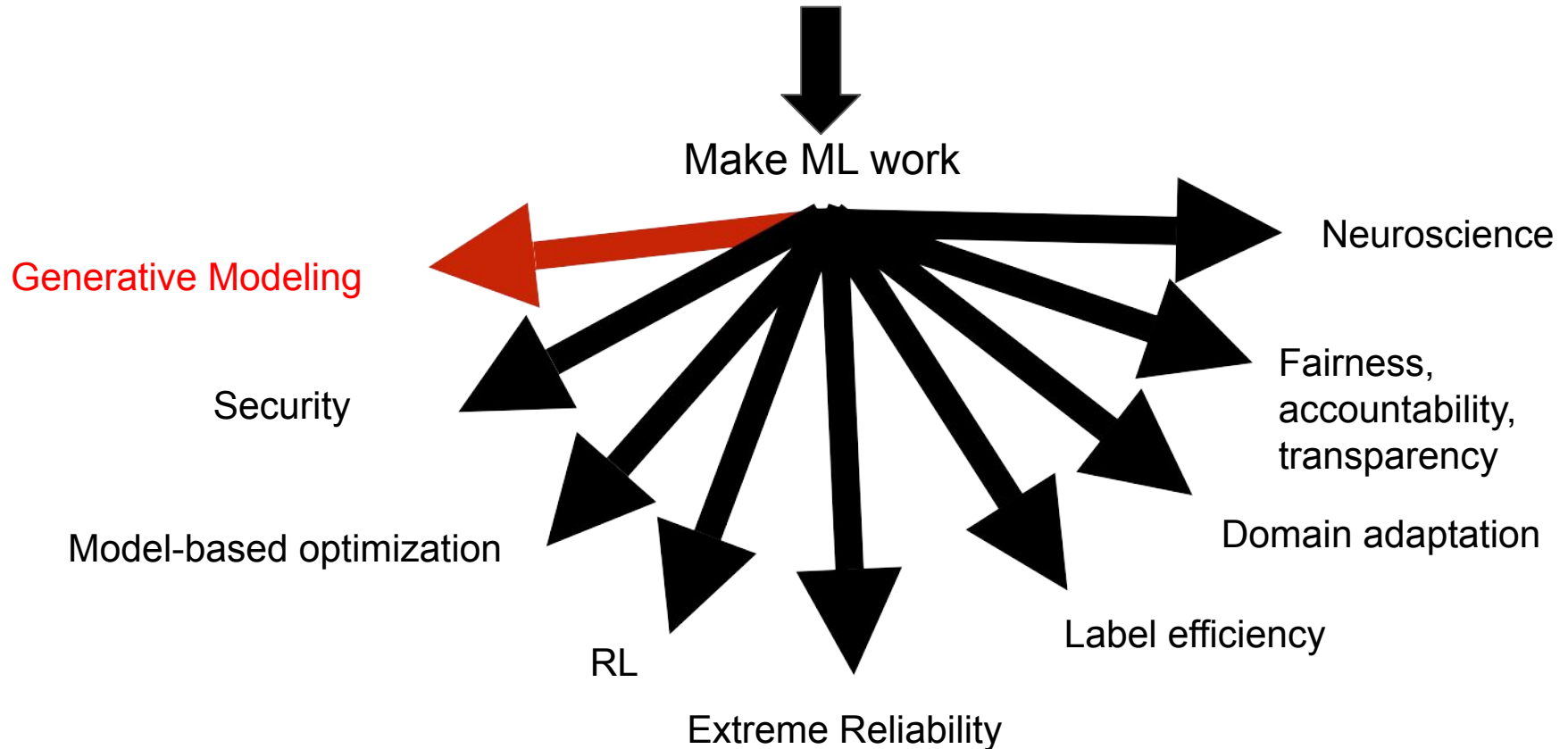
Señales

- Sensores de actividad
- Reconocimiento de voz
- Asistentes virtuales
 - Dominio abierto
 - Dominio cerrado (tareas específicas)



La explosión de Machine Learning

A Cambrian Explosion of Machine Learning Research Topics



Generative Models

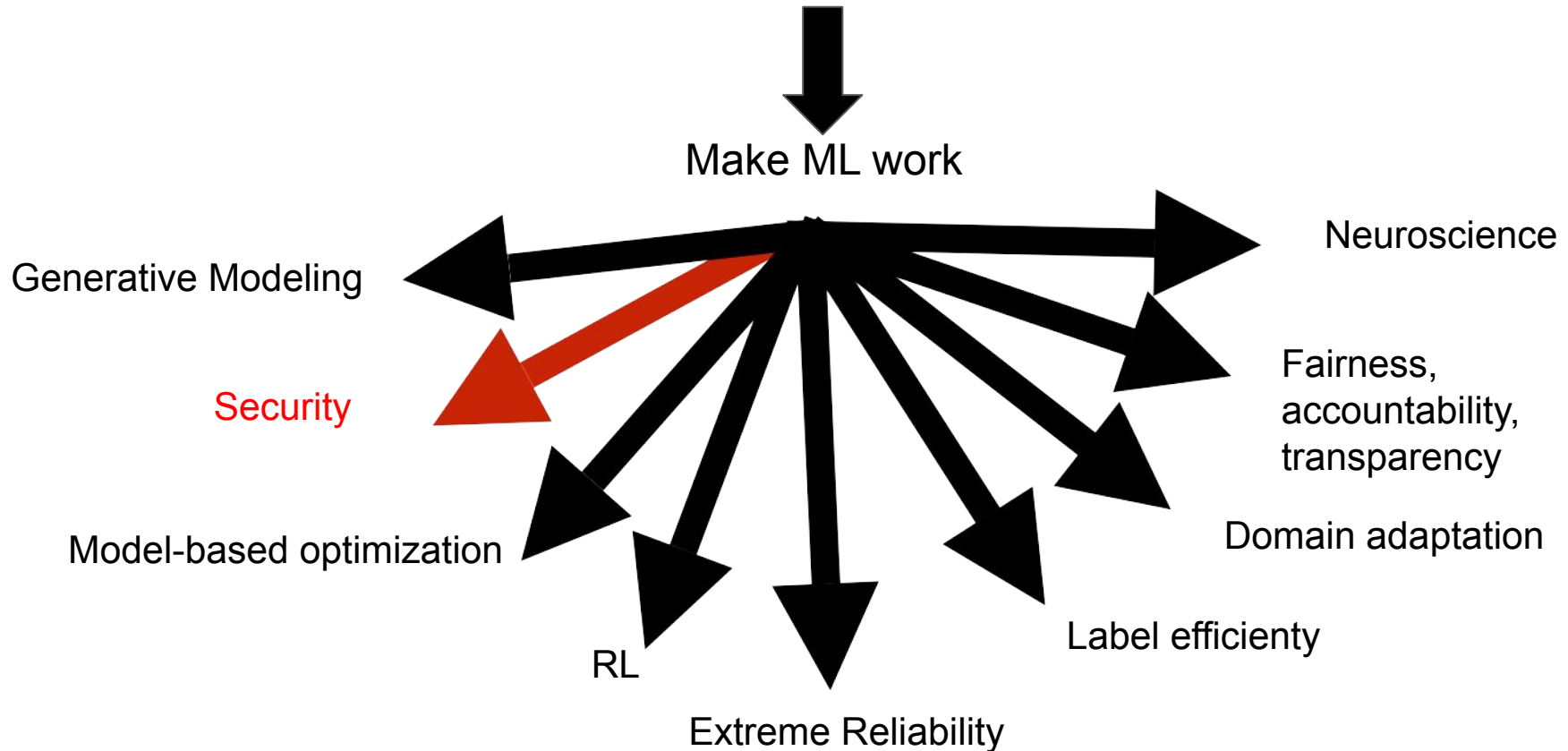
- Imágenes: PixelRNN & PixelCNN
(van de Oor, 2016)
- Señales: VRNN (Chung, 2015)
- Text: RVAE (Bowman, 2015)
- VAE, GANs

If the threatened "counter-revolution"
was not ~~x~~ to bring the President back
the 13 States of the Commonwealth
was an occasion worthy of his
presence. After all it was Mr. Nkrumah
This emphasis on the legality of the



Karras et al, 2017

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Security: Adversarial examples



$+ .007 \times$



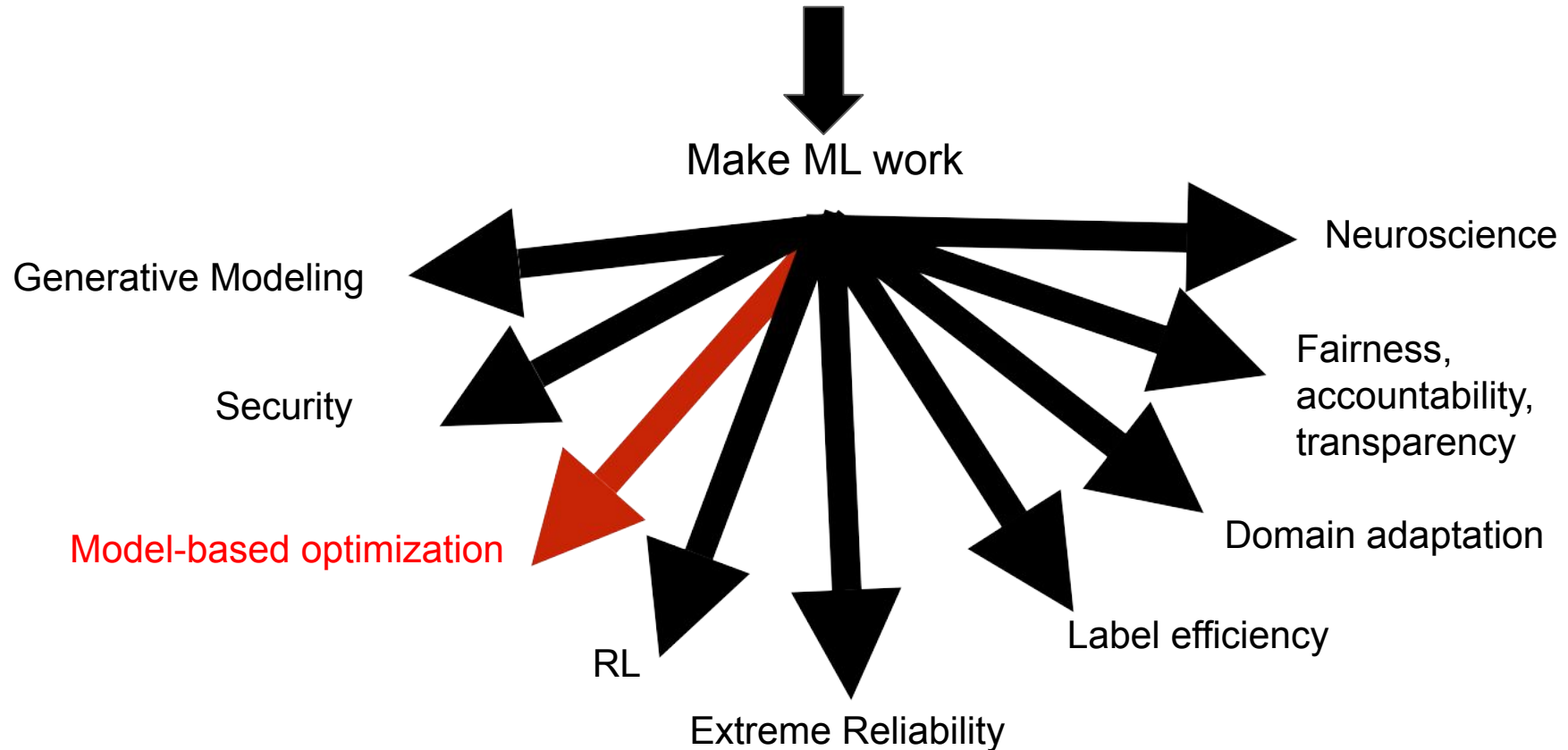
$=$



“Panda” 58%

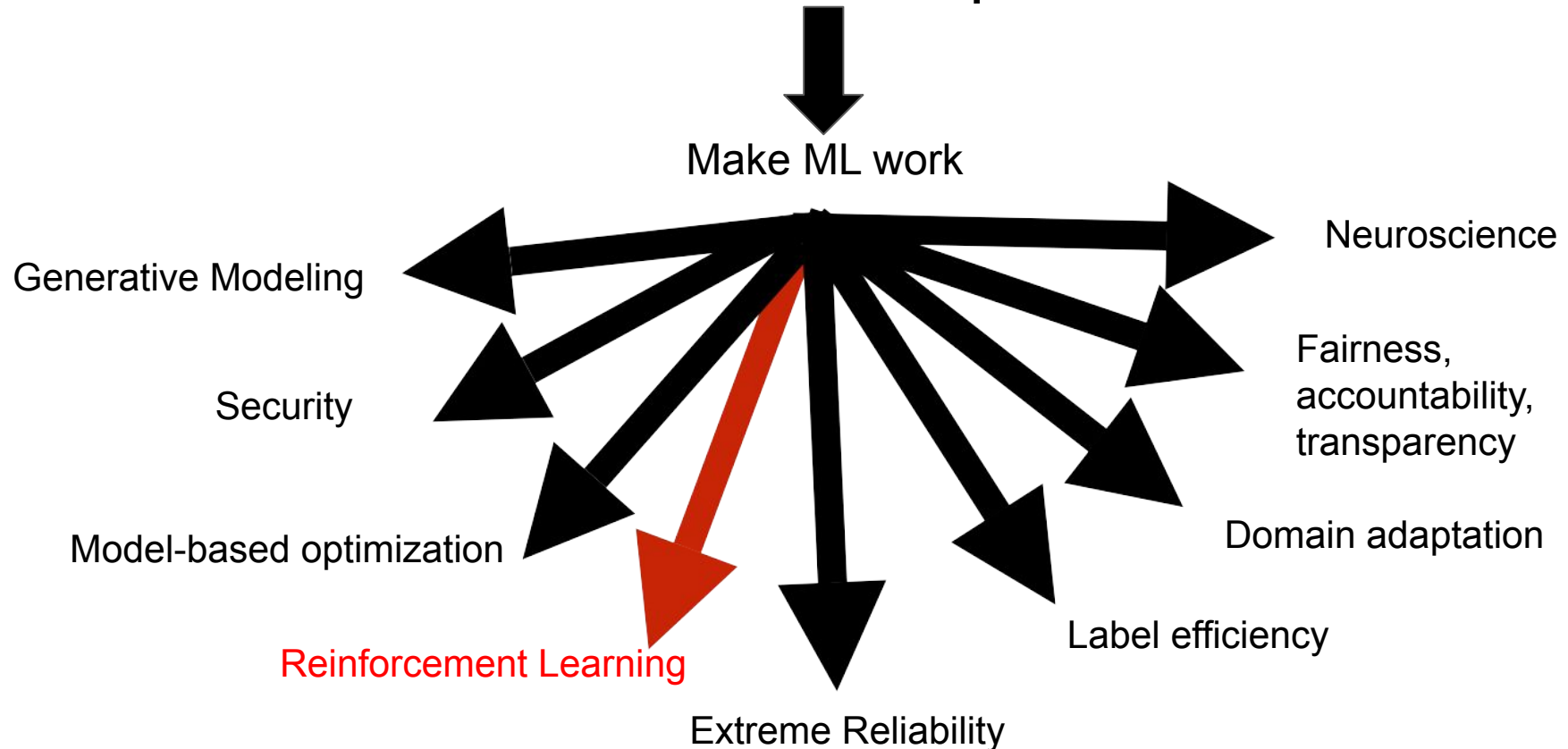
“Gibbon” 99%

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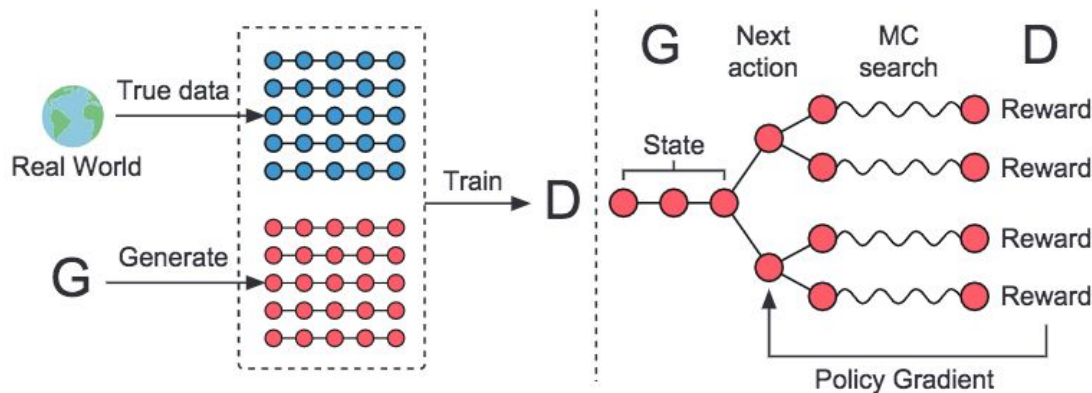
Model-based optimization

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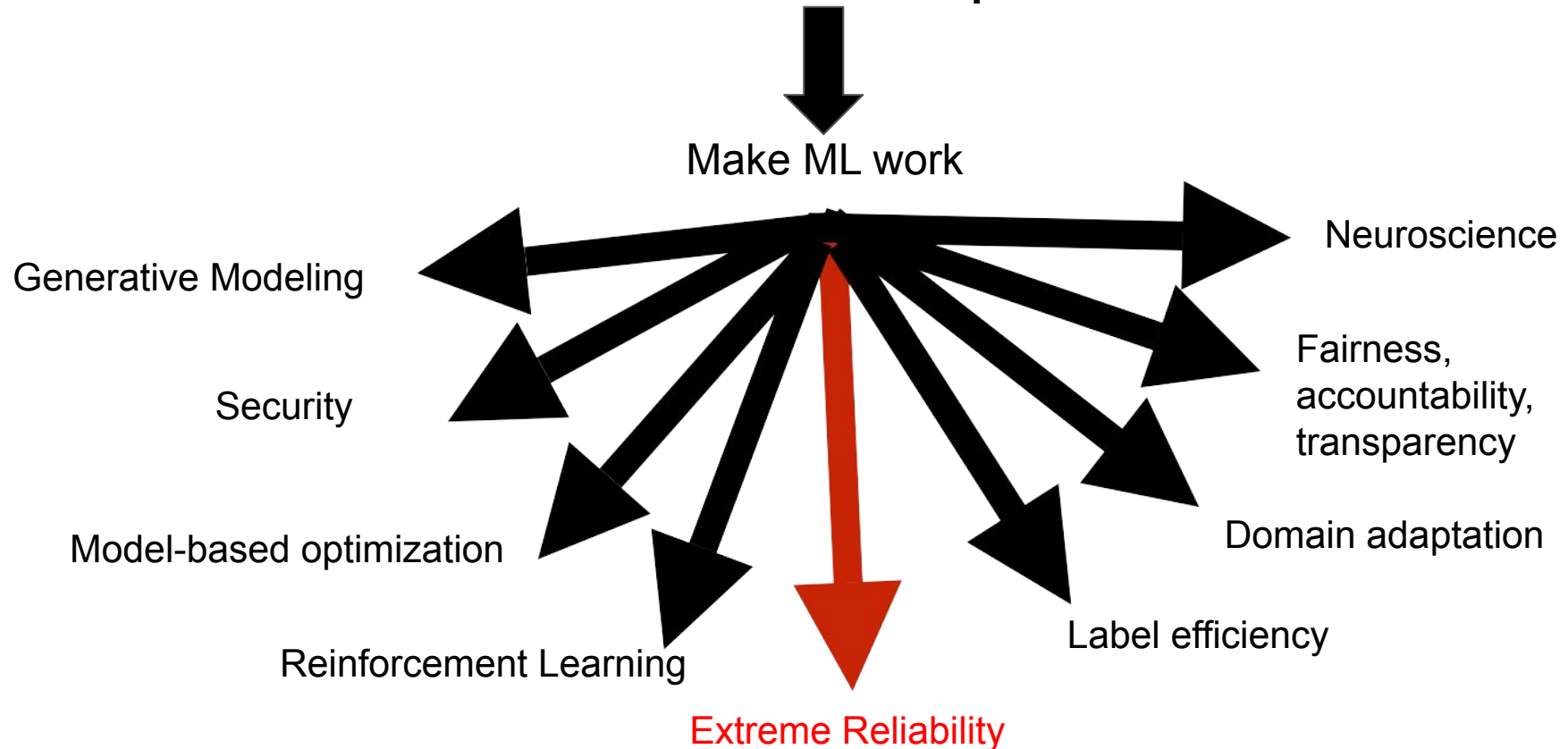


Reinforcement Learning

- Juegos como: Alpha GO, [Atari](#), Starcraft, Dota
- Usado en NLP: Deep Reinforcement Learning for Dialogue Generation (Li, 2017), SeqGAN (Yu et al, 2017), MaskGAN (Fedus, 2018)



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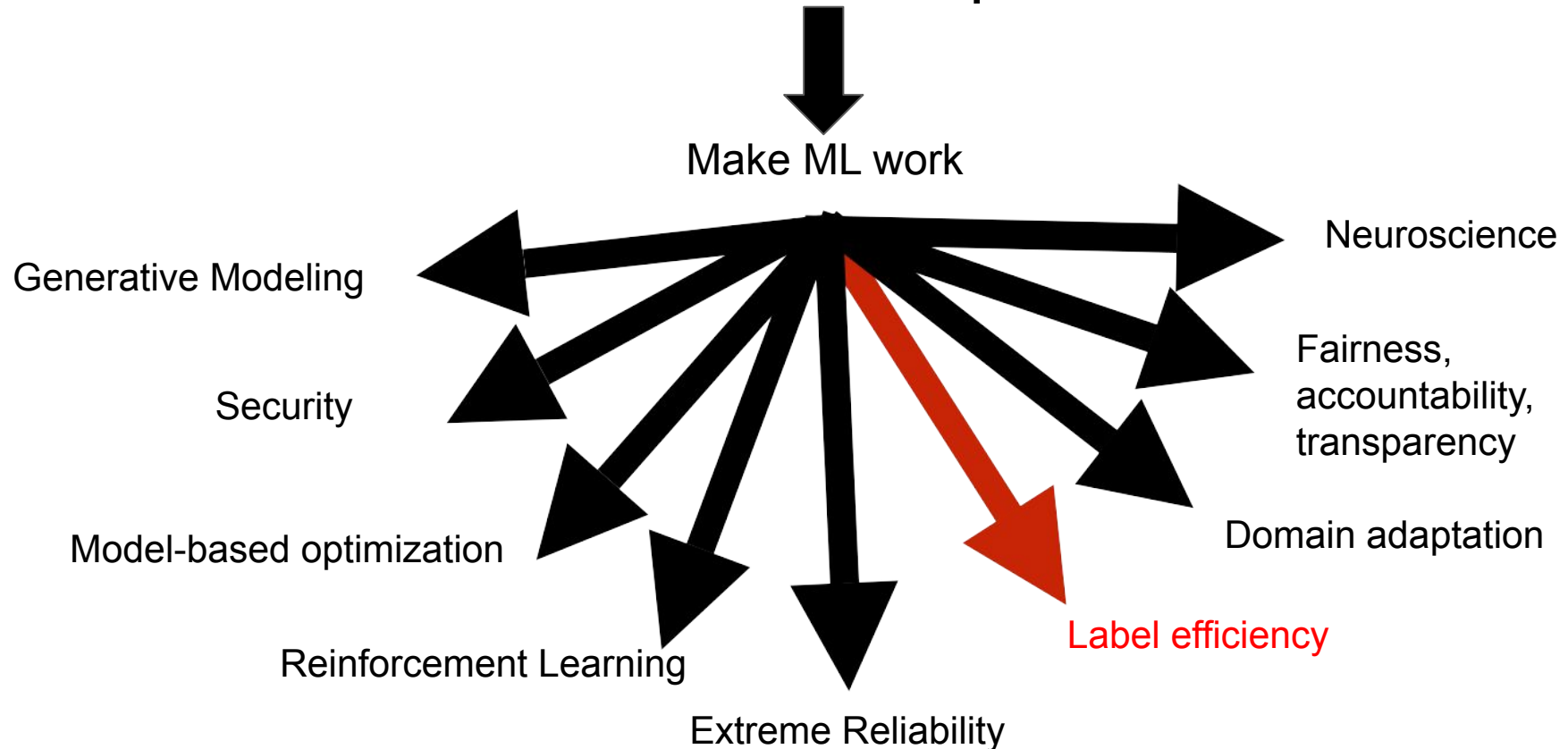


Extreme reliability

- We want extreme reliability for
 - Autonomous vehicles
 - Air traffic control
 - Surgery robots
 - Medical diagnosis, etc.
- Adversarial machine learning research techniques can help with this

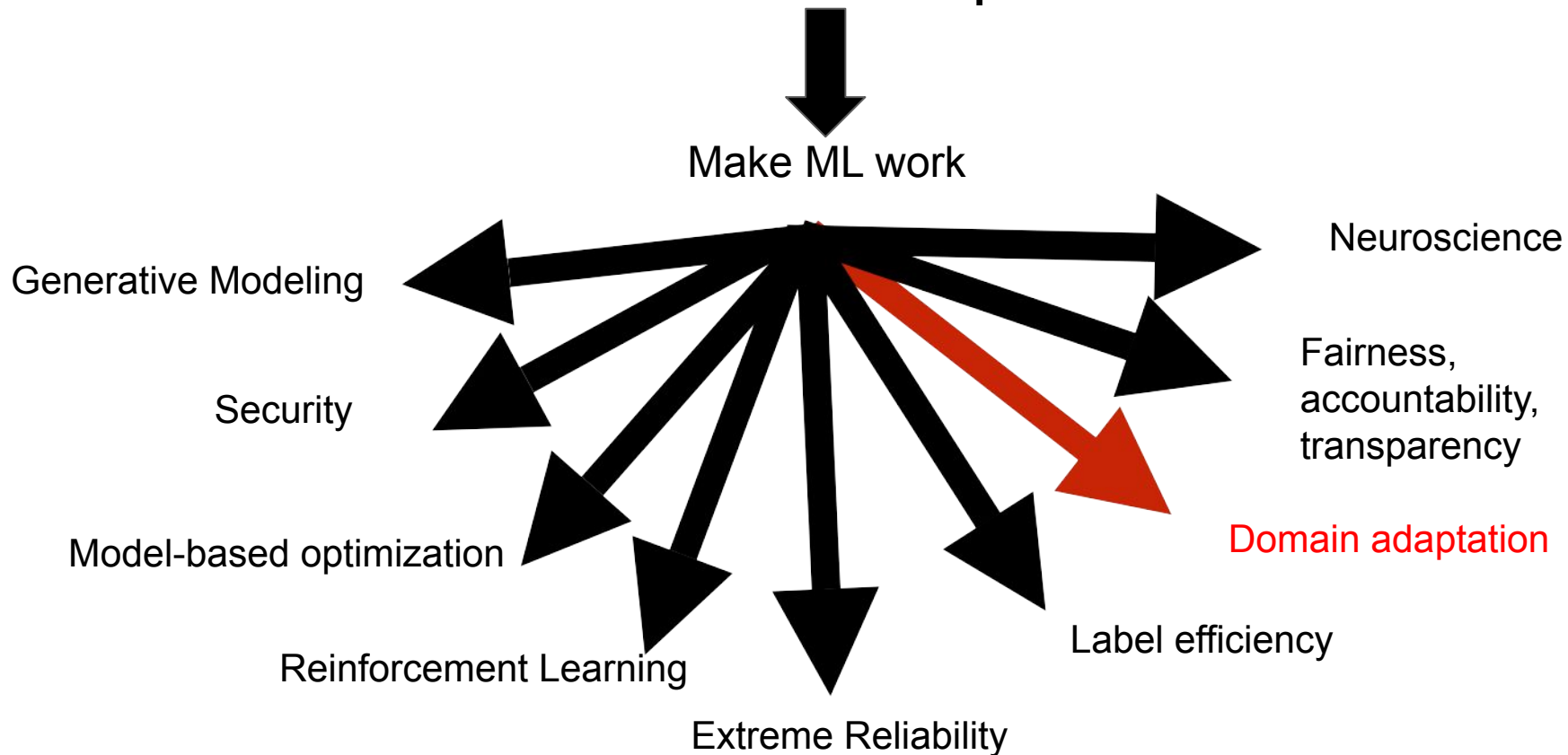


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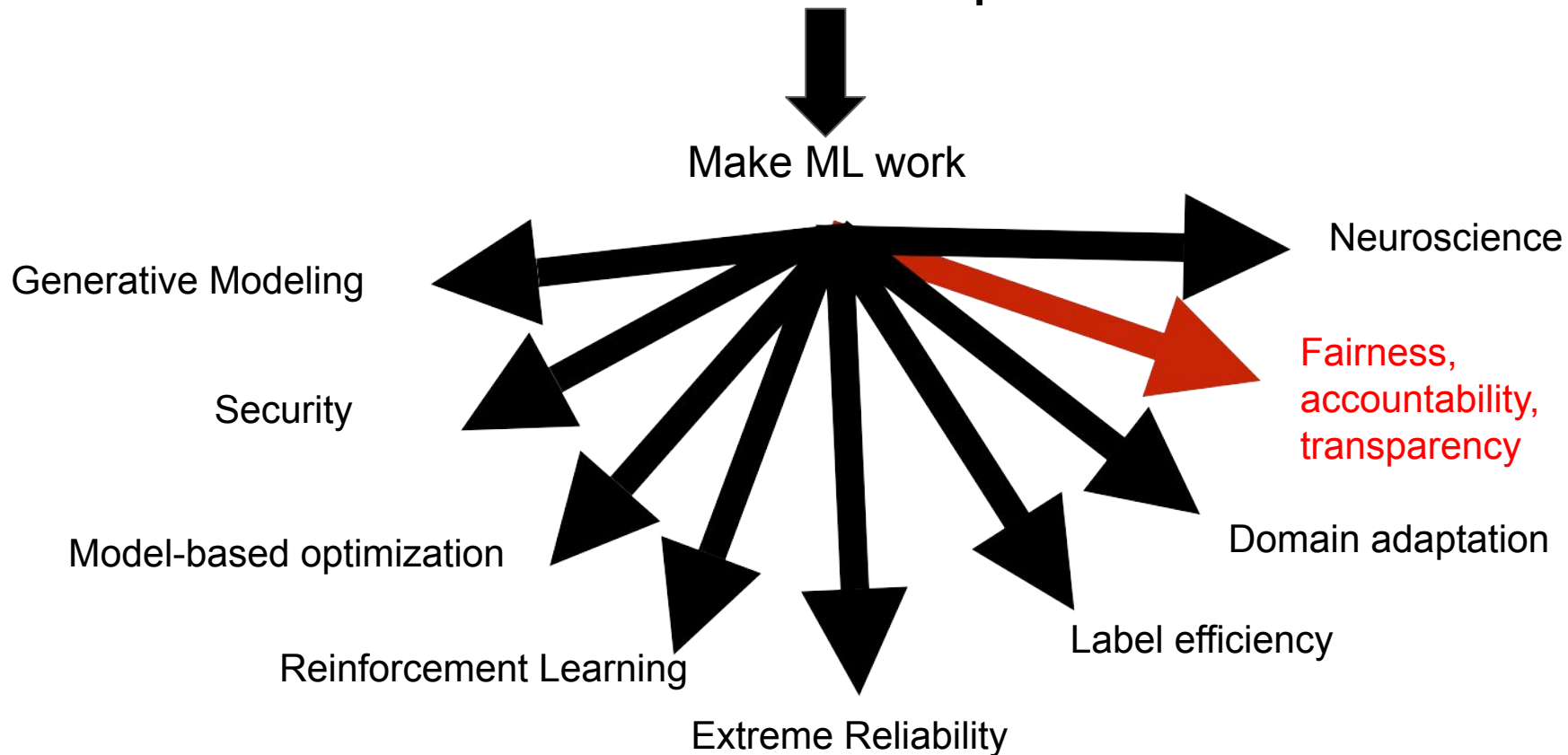
Label Efficiency

A Cambrian Explosion of Machine Learning Research Topics



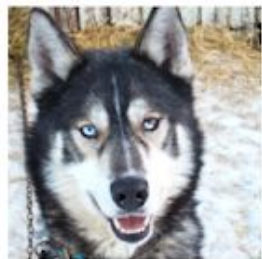
Domain adaptation

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Fairness, accountability and transparency

- Buscar en Google:
 - Las mujeres latinas, blancas, negras son ...
 - En inglés y español
- Is bias always incorrect?
- Interpretability & explainability
- Traducción de doctor de turco a inglés



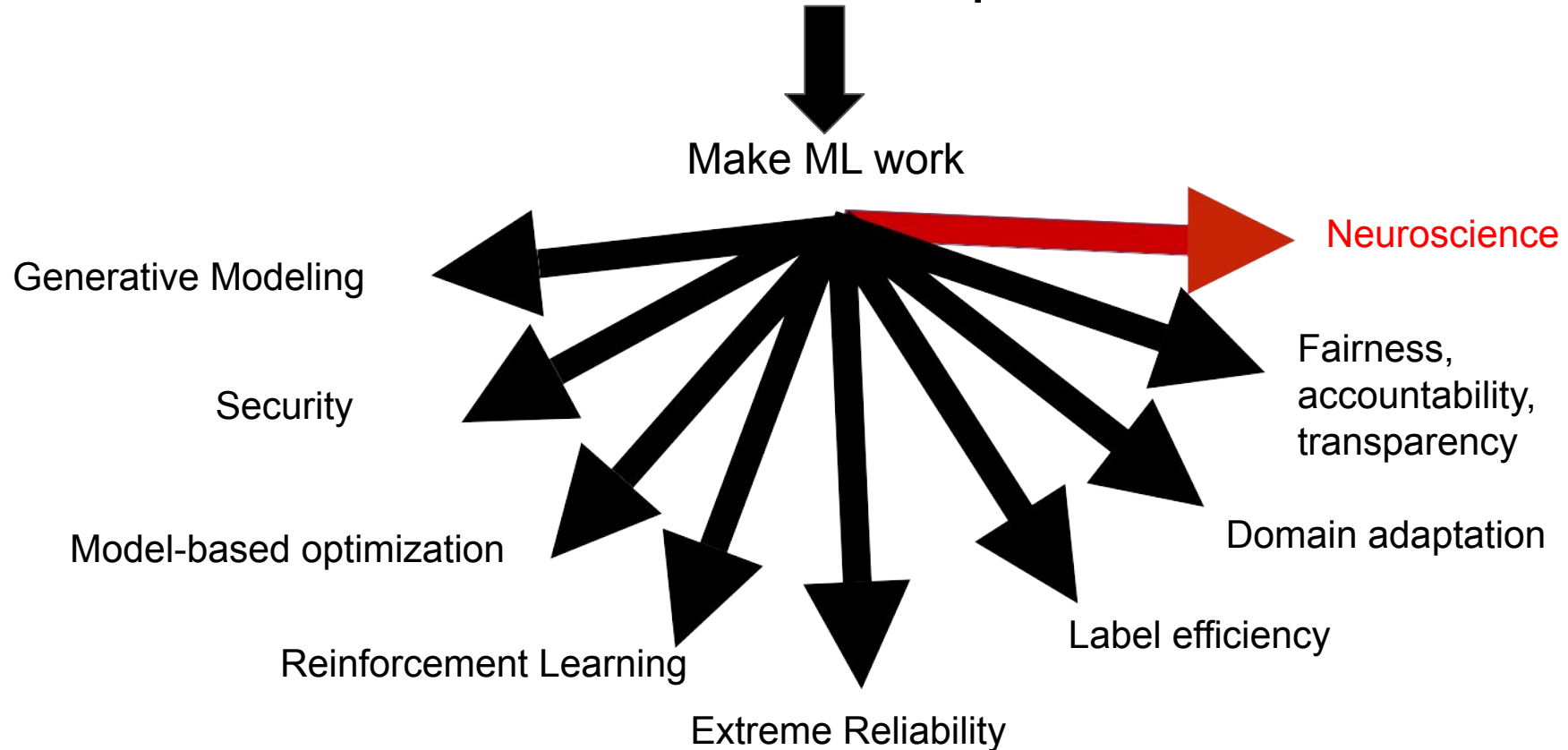
(a) Husky classified as wolf



(b) Explanation



A Cambrian Explosion of Machine Learning Research Topics



Adversarial examples that affect both computer and time-limited human vision



25%
snake



67%
snake

Elsayed et al 2018

Otros campos a investigar

- Neuroscience
- Quantum Computing
- NLU (natural language understanding)
- NLI (natural language inference)
- Meta-Learning

Miscelánea & Recomendaciones

- Saber buscar papers
- Aprender a replicar papers
- Hinton/Bengio: seguir tu intuición, probar y descartar. Ninguna idea es muy loca
- Documentar (README files, tutorials, blogs)
- Aprender Linux
- “Ensuciarse las manos”



Más fuentes de información

- Algunas personas que seguir en Twitter:

- [Yann LeCun](#)
- [Ilya Sutskever](#)
- [Oriol Vinyals](#)
- [Rachel Thomas](#)
- [Sebastian Ruder](#)
- [Fei Fei Li](#)
- [François Chollet](#)
- [Chelsea Finn](#)



- Podcasts: Practical AI, MIT Artificial Intelligence
- Conferencias: AAAI, ICML, ICLR, NeurIPS, CVPR, ICCV, ACL, NAACL, EMNLP



MUCHAS GRACIAS POR VENIR

W W W . D A T A S C I E N C E . P E