#### DEEP LEARNING FOR ENTERPRISE



# THE WAY HEALTHCARE MAKES DECISIONS IS CHANGING

- Evolving Statistical Models
- Real-time Inference
- More Diverse Datasets



### FROM BI TO AI

# Superhuman accuracy in machine perception



# THE TOP TECH COMPANIES ARE POWERED BY AI

- Google (Alphabet)
- Facebook
- Amazon
- Microsoft

#### Skymind THE REST WILL FOLLOW

**Tier 1 companies** have built their own deep-learning frameworks. This handful includes Google, Facebook, Microsoft, Amazon and Baidu.

**Tier 2 companies** build their own deep-learning solutions using an external framework. These include some financial, e-commerce, tech and telecom companies. They have quants and data scientists. Skymind can support them.

Tier 3 companies know how to gather, store and move data, but they may not have mastered deep learning. Skymind can build their solutions and train them.

> Tier 4 companies outsource their data management or lack a complete data strategy and team. Skymind can point them to other resources to develop in-house skills and advise them on the best path forward.

### **CONSIDER ALPHABET**

- Q2 2017 rev = \$26B
- Up 23% YoY (constant currency)
- "Surge in mobile and video ad sales"
- But why are ad sales surging?

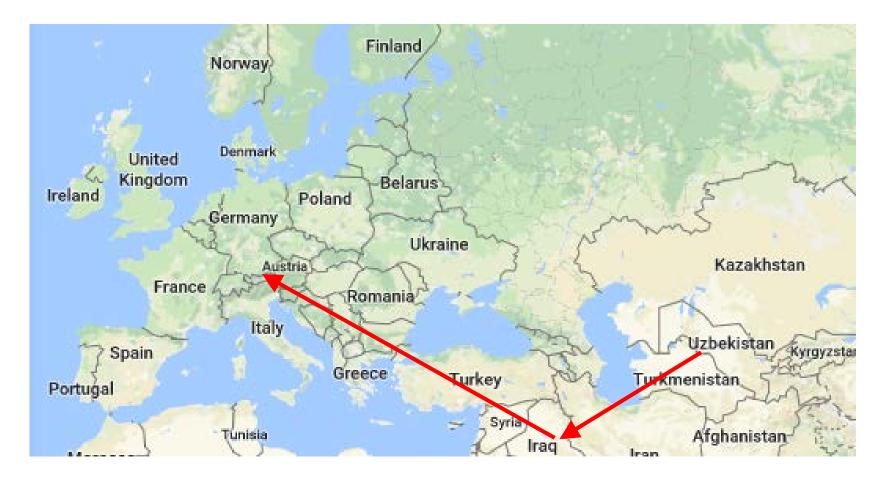
#### WHAT'S AI?

Algorithms

# Algorithm: A City in Uzbekistan



### **Medieval Movement of Math**



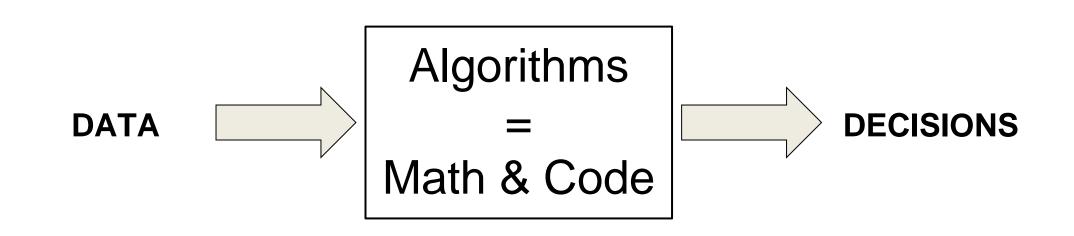
### WHAT'S AI?

Algorithms

Math & Code



### WHAT'S AI?



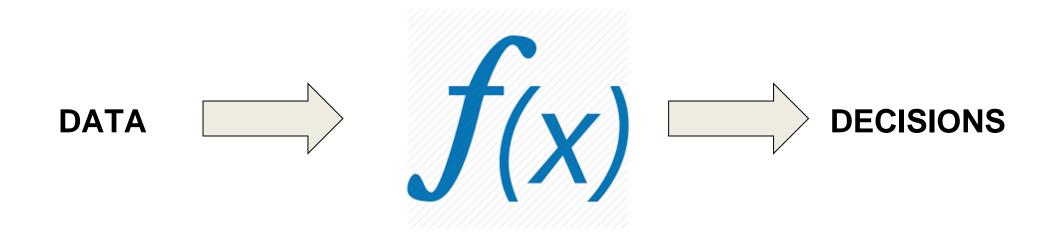


### **Human Perception**



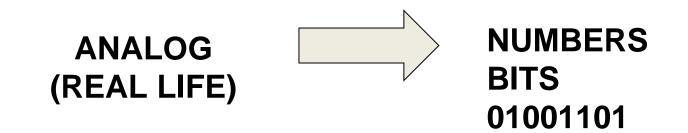


### **Machine Perception**

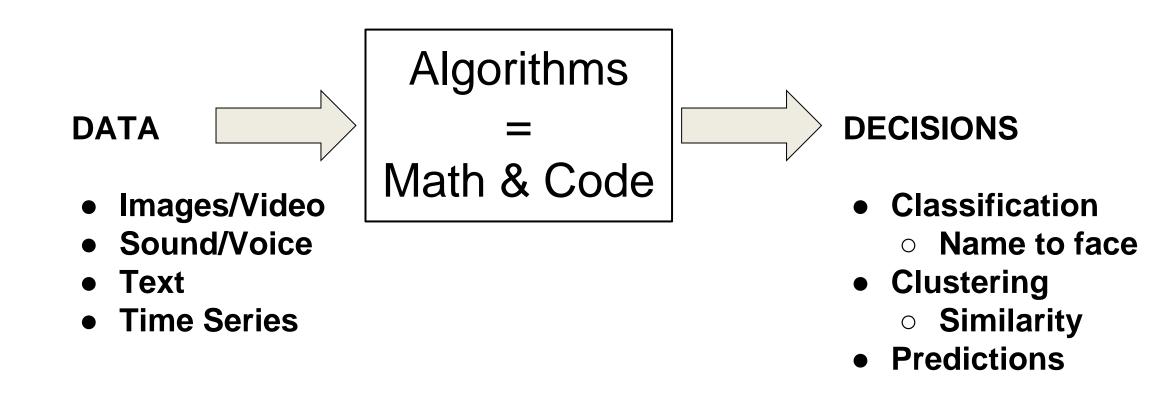




## **Prerequisite: Digitization**



### WHAT'S AI?



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"the team decided to enter the contest at the last minute and designed its software with *no specific knowledge* about how the molecules bind to their targets... working with a relatively *small set of data*"



A student team led by the computer scientist Geoffrey E. Hinton used deepThe technology, called de to use in services like App which is based on Nuance recognition service, and i machine vision to identify

But what is new in recent accuracy of deep-learning neural networks or just "r to the neural connections.

"There has been a number of stunning new results with deep-learning methods," said Yann LeCun, a computer scientist at New York University who did pioneering research in handwriting recognition at Bell Laboratories.



#### Scientists See Promise in Deep-Learning Programs



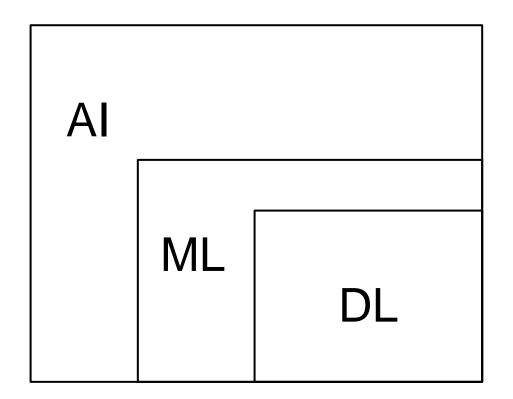


#### Alvs. MLvs. DL





### Alvs. MLvs. DL



### Al vs. ML vs. DL

- Good old-fashioned AI is based on rules (non-ML AI)
  - Rules tell a computer how to respond to different situations
  - Called expert systems or rules engines
  - Static
- Machine learning
  - ML algorithms adapt when exposed to new data
  - Self-adjusting to improve performance on narrowly defined tasks
  - Dynamic
- Deep learning
  - Computationally intensive
  - Superhuman accuracy
  - State of the art

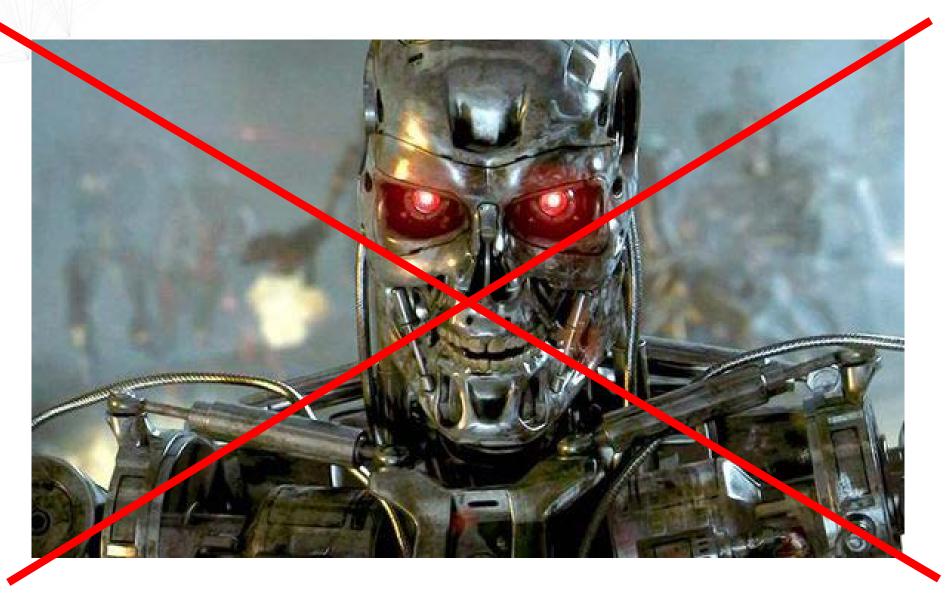


#### CAPABILITIES



# It's be hard to explain the difference between what's easy and what's virtually impossible.

#### What Al Isn't



# Strong Al vs. Narrow Al

- Can outperform humans on every task
- Is embodied
- Has sense of self
- Seeks to maximize chances of survival, domination
- Is able to increase its own intelligence

• Solves one problem well

## Skymind What Al Can Do



Super-human performance in Go, Texas Hold 'em

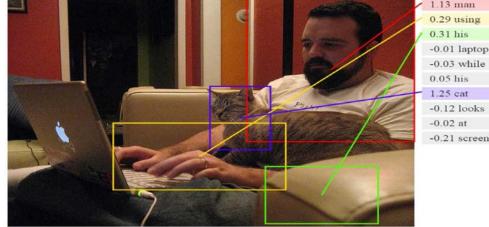


Image recognition and captioning



Machine language translation



Speech recognition and dialog systems

# Skymind Skype TRANSLATE

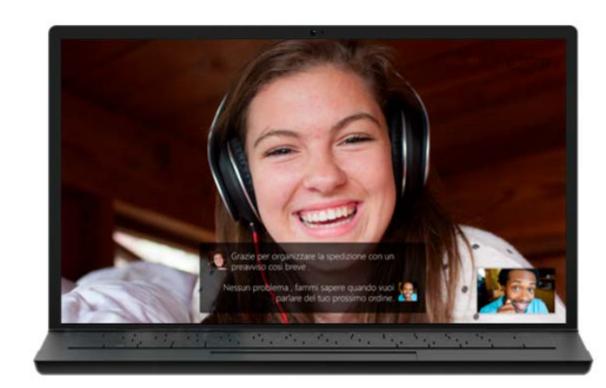
#### Skype Translator

Break down language barriers with your friends, family and colleagues.

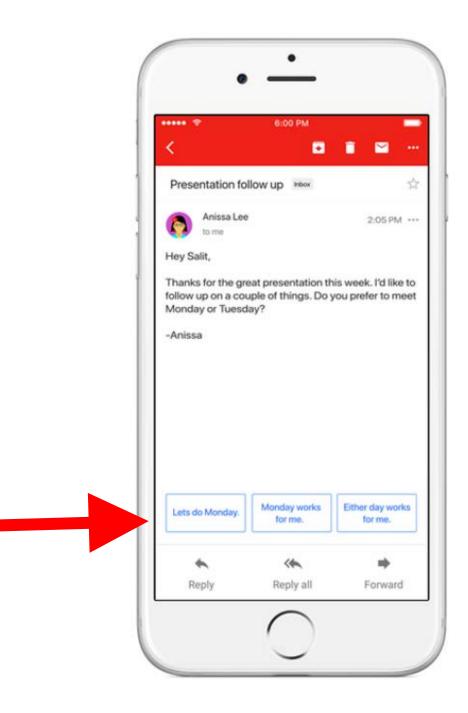
Our online translator can help you communicate more clearly. Our voice translator currently works in 8 languages, and our text translator is available in more than 50 languages for instant messaging.

Skype Translator uses machine learning. So the more you use it, the better it gets.

Get Skype for Vindows desktop

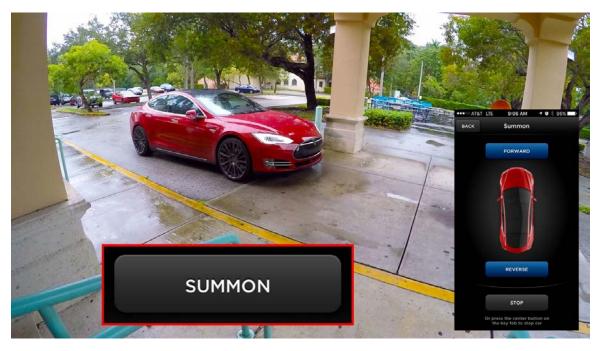


### skymind GOOGLE AUTO REPLY



# Skymind SELF-DRIVING CARS





#### skymind AUTONOMOUS DRONES

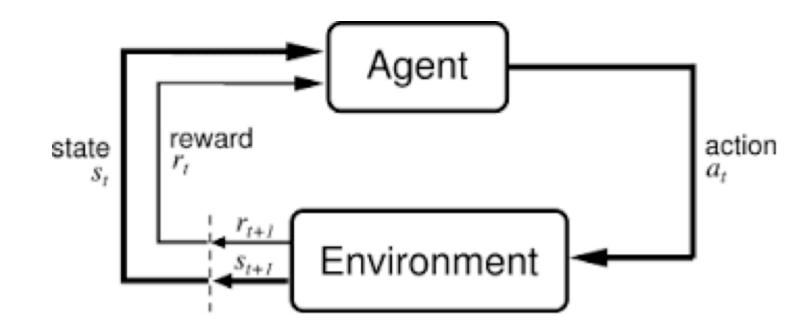




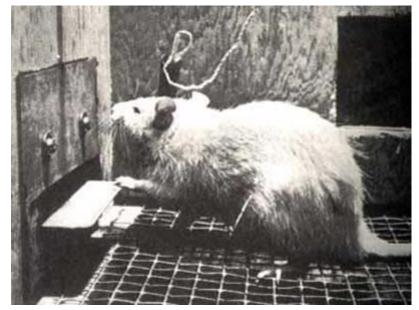
### AlphaGo = DL + RL

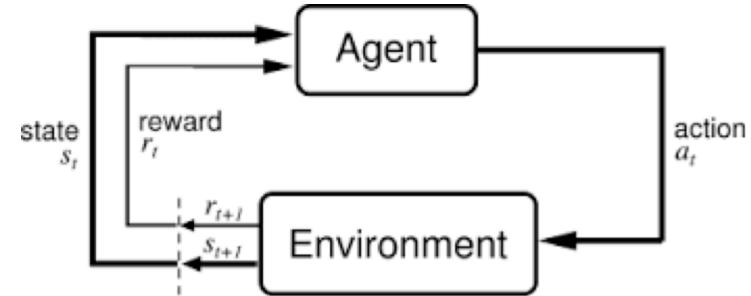






# **Reinforcement Learning**







### CONSTRAINTS



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# TO BUILD AI YOU NEED 4 THINGS

- Team
- Tools
- Data
- Infrastructure



### Team

- Data Scientists/ML specialists
  Analyze data, prototype models
- Data Engineers
  - Gather, move and store data
- DevOps
  - Maintain Al in production



#### TOOLS

### WHAT DOES ENTERPRISE NEED?

- Open-source (Linux, Hadoop)
- Scalable, Containerized, Fast
- Integrates With Existing Tech (JVM)
- Cross-Team Solution (DevOps, Data Science)
- General-Purpose, Customizable Framework

# DATA

- Deep learning needs data to train on
- That data must match the problem you want to solve
- If you lack labeled data (e.g. face, name), a labeled data set can be built
- The more, the better



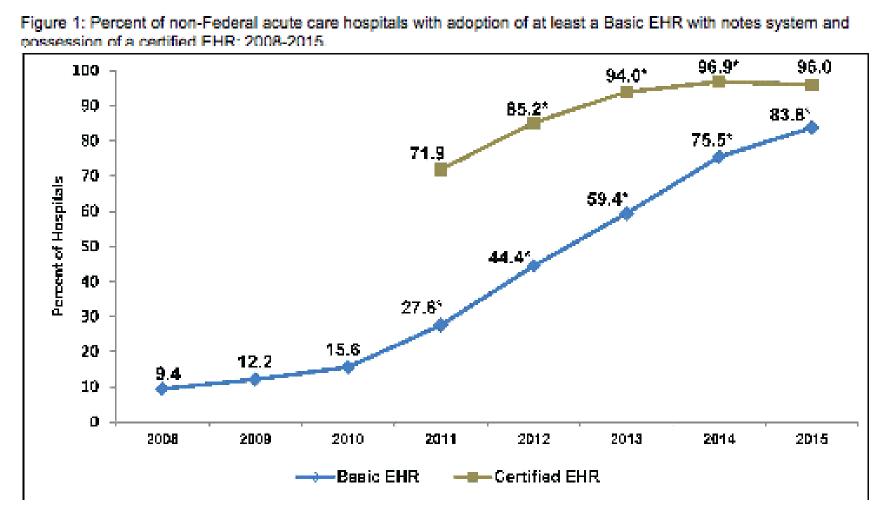
## INFRASTRUCTURE

- Al sits on top of the big data stack
- You need software that can gather, move and store data at scale
- E.g. Hadoop, Spark, Kafka, Elasticsearch
- And you need a hardware cluster for compute (GPUs will speed it up.)



## AI FOR HEALTHCARE

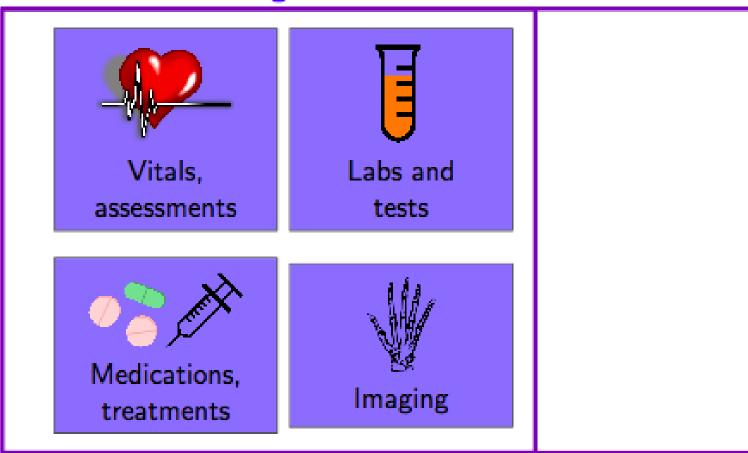
### Explosion in digital health data: EHR adoption



ONC Data Brief 35, May 2016

### Explosion in digital health data: diversity of clinical data Clinical EHR

Measured during clinical care



Skymind Inc. 1328 Masson St., San Francisco GA-94163, USA.

## "The patient is data."



The patient!

Randall Wetzel, Virtual PICU, Children's Hospital LA

## Peering into the recurrent neural network

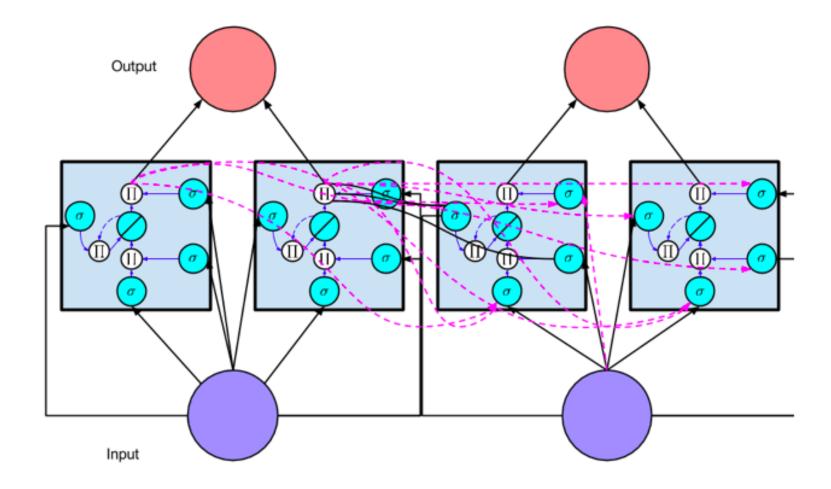


Figure courtesy of Zack Lipton, Amazon/CMU



#### Dave Kale

- PhD candidate, USC Information Sciences Institute
- Founder of Machine Learning for Healthcare (MLHC) Conference
- Deep Learning "Wizard" at Skymind

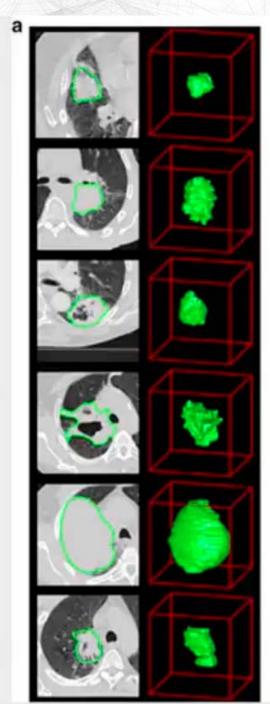
## PhysioNet Challenge 2012 results

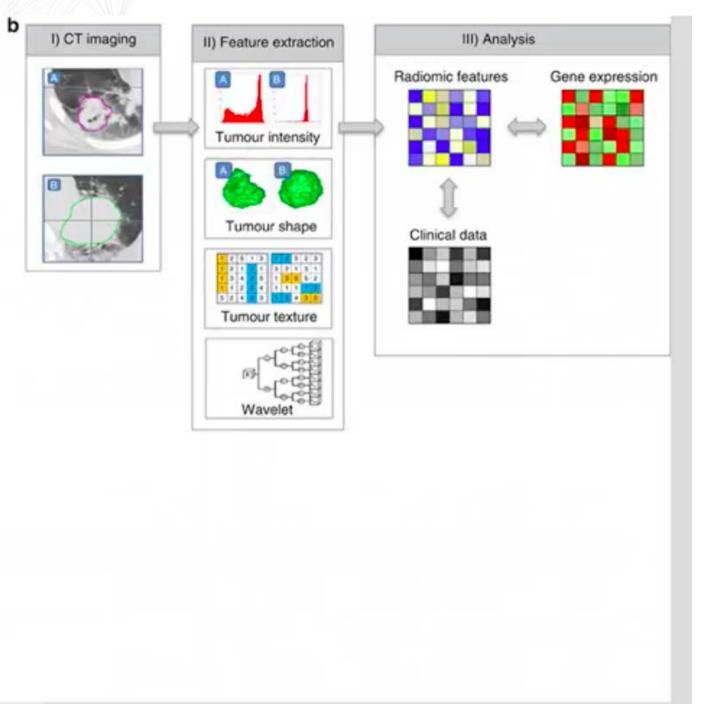
Model		AUC*
Kale, et al., AMIA 2015	SVM using hand-engineered features + features learned by MLP	0.8450
Skymind + Cloudera	LSTM with raw time series + missing data indicators	0.8520
Johnson, et al., CinC 2012 (winner of Event 1)	Bayesian ensemble with hand-engineered features	0.8602

\* AUCs not directly comparable due to use of different training/test split policies

PhysioNet Challenge 2012: https://physionet.org/challenge/2012

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# FUZHOU: NAT'L HEALTHCARE BIG DATA CENTER





## WARNING & CALL TO ARMS





## **SKYMIND'S STORY**

## FOUNDERS (YC W16)

#### ADAM GIBSON, CTO



Deep learning @GalvanizeU

- Author: O'Reilly's "Deep learning: A Practitioner's Guide" Mar. 2016
- Speaker: Hadoop Summit, OSCon, Tech Planet, GigaOM
- 3x startup founder
- CS/Biz @Michigan Tech

#### CHRIS NICHOLSON, CEO



Sequoia's FutureAdvisor

- As a recruiter: Helped triple team through Series B to 45 staff
- As PR: Helped drive 45x rev. and AUM growth (\$650M in June 2015)
- New York Times correspondent covering tech, M&A: 2006-2011



Hacker House



# **COMPANY OVERVIEW**



PhDs



# **BUSINESS MODEL**

- Red Hat for Al
- Custom deep learning solutions for Fortune 2000 corporations and governments using open-source software
- A commercially supported enterprise distribution of open-source software



# WHAT WE SELL

### Services (Proof of Concept)

Custom deep learning model built by Skymind.

### Training

Corporate deep learning workshops led by a Skymind instructor.

### **Support**

Ongoing model support and maintenance.

# SKYMIND TOOLS

*Deeplearning4j* Build, train, and deploy neural networks on JVM

#### RL4J

Reinforcement learning algorithms on JVM

#### ND4J

High performance linear algebra CPU and GPU libraries

#### Arbiter

Hyperparameter search for optimizing neural networks

#### DataVec

Data ingestion, normalization, and vectorization

#### Model Import

Import and deploy neural networks trained in Caffe, Keras, TensorFlow & Theano

### DEEP LEARNING FOR ENTERPRISE

help@skymind.io