Understanding Artificial Intelligence What a well informed person should know

Marc Cohen

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Welcome



1.794.9

Prerequisites

- You are human (bots not allowed)
- You are curious about AI and want to learn more
- No technical knowledge required
- No programming required
- No maths required

- Gain a conceptual understanding of how AI "works"
- Find out about the state of the art in Al
- **Consider the ethical issues raised by Al** \bullet
- Think critically about AI in your life and in the world \bullet
- Help you prepare for the continuing revolution

Goals

Deep dive into technology or maths \bullet **Definitively answer difficult ethical or societal questions**

- **Predict the future**

Agenda

- My Fave Al App
- **Definitions**
- History
- <u>Mechanics</u>
- <u>State of the Art</u>
- Ethics
- The Future

Option 1 - Interactive Trivia Quiz Challenge Game

Inspired by <u>quizup</u> but a PWA rather than a native app and used as a way to illustrate backend design principles. We'll build this app in steps and highlight important lessons as they arise in the design process.

Requirements

- Usage flow

 - 0
 - Establish a user profile Ο
 - Challenge random or selected opponent to real time trivia challenge 0
 - Challenger selects subject, responder accepts or rejects (repeat until agreement) Ο
 - Quiz conducted in real time using webRTC data (with optional video) Ο
 - **Results are persistent** Ο
 - Leaderboards maintained 0
 - Questions are accessed dynamically via network (caching is not particularly helpful because real 0 time contents won't work while offline)
 - Utilize an open trivia question database
- Implemented as a PWA
- Both a hosted service and an open source code example
- FE uses either react or Angular 2 (TBD)
- Use to illustrate state of the art back end capabilities

App Stages

- 2. Add successive features by implementing an API (REST or gRCP). With each step, highlight options and
 - considerations in choosing backend technology
 - a. sign in and user profile management

August 2016

• Visit site (quizr.io)

Anonymous mode works out of the box

Ability to do quiz challenges with random other users but no user profile, no persistence of results, no leaderboard, no history

1. FE - UI starts with anonymous mode only.

March 2023

Wouldn't it be cool to have a free quiz game for everyone powered by AI?

(pronounced like mosaic)

questions based on category {topic}.

Generate a {num questions} multiple choice quiz

Generate a {num_questions} multiple choice quiz questions in Swedish based on category {topic}.

Generate a {num_questions} multiple choice quiz questions based on category {topic} in Swedish.

Current Prompt

You are a trivia expert.

Category: {topic} Quiz difficulty level: {difficulty} Quiz language: {language}

RULES:

- Accuracy is critical. selected from the responses array. "responses", and "correct".

OUTPUT:

```
Generate a set of multiple choice quiz questions.
```

```
Number of questions: {num questions}
Number or responses per question: {num_answers}
```

```
- Each question must have exactly one correct response,
- Output should be limited to a json array of questions, each
of which is an object containing quoted keys "question",
- Don't return anything other than the json document.
```


Definitions

- Artificial Intelligence
- Machine Learning
- Neural Network
- **Deep Learning**
- <u>Generative Al</u>

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klepio. toj de Romo. mal~anto: malantaŭe mizer estis tute en mal~o^Z; elmeni mal~on^Z; mal~o min kaptas malgrasiĝintan vizaĝon de na Rilata al mal~o: fajro de ma krio^Z. **mal~igi**. Senigi je ~o ne plu konservas ~on: sen~o treni sen~an ekzistadon^Z. **Se**

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Photo by <u>Stefan</u> on <u>Unsplash</u>

Definition: Artificial Intelligence

The creation of algorithms and systems capable of performing tasks that typically require human cognition, such as learning, reasoning, perception, decisionmaking, and natural language processing.

Definition: Machine Learning

The use and development of computer systems that are able to learn and adapt without following explicit instructions, by using algorithms and statistical models to analyze and draw inferences from patterns in data.

Because you watched The Queen's Gambit

Top Searches

Emmy-winning TV Programmes

Definition: Neural Networks

A machine learning (ML) technique that uses a network of interconnected layers of nodes to process data in a way that bears some resemblance to the human brain.

Neural Networks

From the ground up

Definition: Deep Learning

A type of machine learning that uses multi-layer neural networks to train computers to process data and make human-like decisions. Deep learning systems learn from large amounts of data, including images, text, audio, and video to recognize patterns, make predictions, and automate tasks.

DEEP LEARNIN with Python

François Chollet

Definition: Generative AI

Deep-learning models that can generate highquality text, images, video, and other content based on the data they were trained on.

Artificial Intelligence

> Machine Learning

Neural Networks

Deep Learning

Generative AI

Deep Learning

History How did we get here?

- Founders
- Timeline

Card Type Standard ~ THE VIRTUAL KEYPUNCH

Alan Turing

A Turing Machine is a theoretical construct that captures the essence of abstract symbol manipulation, i.e. computing. This invention inspired the founding of Computer Science and started the discussion about the possibility of thinking machines.

The Turing Test (1950)

If a machine could carry on a conversation that was indistinguishable from a conversation with a human being, then it was reasonable to say that the machine was "thinking". This was the first serious proposal about how humanity might achieve artificial intelligence.

We'll conduct our own Turing Test later!

By Juan Alberto Sánchez Margallo - File:Test_de_Turing.jpg, CC BY 2.5

Claude Shannon

- Invented digital computer design
 - World's Greatest Master's Thesis!
- Father of Information Theory
 - Mathematical definition of communication
 - First appearance of the word "bit"
- Designed the first chess computer

ROMANES/ SINCE 1892 **IDEAS OF DISTINCTION**

Geoffrey Hinton

Dems **lassabs** #299 Lex Fridman

Demis Hassabis

Charles Babbage Arthur Samuel developed designs the Analytical a program to play **Engine**, an early checkers, which is the mechanical generalfirst to ever learn the purpose computer. game independently. 1836 1950 1952 **Alan Turing publishes "Computing Machinery** and Intelligence," introducing the Turing Test.

John McCarthy created LISP, the first programming language for AI research, which is still in popular use to this day.

1958

John McCarthy, Marvin Minsky, Nathaniel **Rochester, and Claude** Shannon organize the **Dartmouth Conference**, coining the term "Artificial Intelligence."

1956

Arthur Samuel created the term "machine learning" in a speech about teaching machines to play chess better than the humans who programmed them.

1959

Edward Feigenbaum and Joshua Lederberg created the first "expert system" to replicate the decision-making abilities of human experts.

1965

The first Al winter begins as funding and interest decline due to unmet expectations.

1972

Joseph Weizenbaum created the first "chatterbot" (later shortened to chatbot), ELIZA, a mock psychotherapist, that used natural language processing (NLP) to converse with humans.

1965

Fei-Fei Li launches ImageNet, a largescale visual database for object recognition.

Apple released Siri, the first popular virtual assistant.

2006

2009

2011

Geoffrey Hinton and colleagues publish a paper on deep belief networks, sparking renewed interest in neural networks.

<u>Watson</u> (created by IBM) won Jeopardy against two former champions in a televised game.

Jeff Dean and Andrew Ng at Google trained a neural network to recognize cats.

2011

2012

2012

2012

AlexNet, developed by Alex Krizhevsky, Ilya **Sutskever, and Geoffrey** Hinton, wins the **ImageNet competition**.

3,000 leaders signed an open letter to the worlds' government systems banning the use of autonomous weapons in war.

Why did everything change so quickly?

A perfect storm:

- **Moore's Law** \bullet
- **GPUs**
- **Cloud computing**
- **Data abundance**
- **Github + Open Source** •
- **New & improved techniques** •
- Transformers

Exponential Growth

THE KURZWEIL CURVE

Mechanics 20 Description 20 Descript

Puppy vs. Muffin

Not so easy

"The brown quick fox jumps over the lazy dog."





English Adjective Order

- 1. Quantity or number
- 2. Quality or opinion
- 3. Size
- 4. Age
- 5. Shape
- 6. Colour
- 7. Proper adjective
- 8. Purpose or qualifier



Machine learning is learning from rules *plus experience*



- Alan Turing, 1950

"Instead of trying to produce a program to simulate the adult mind, why not rather try to produce one which simulates the child's mind?"

This is the main idea behind Machine Learning



Paradigm Shift





Types of Machine Learning

Supervised Learning

- labeled data
- learn relationships

Examples:

- spam detection
- •image classification

Unsupervised Learning

- unlabeled data
- find data structure
- Examples:
- customer segmentation
- anomaly detection

Reinforcement Learning

- reward based
- find optimal strategy
- Examples:
- game playing
- autonomous driving



Supervised Learning Example Cats vs. Dogs

- 2009 world's most advanced computer can't tell a cat from a dog
- 2012 solved by Google *but* required 16,000 computers!
- 2015 Microsoft, Google beat humans at image recognition
- 2019 AI beats Stanford radiologists in chest X-ray diagnostics competition





Unsupervised Learning Example



	0.	
User 1	4	
User 2	5	
User 3		
User 4		
User 5		



Cloud of similarities

Marc Anthony Ren a Vancel

Jorge & Mateus

Alessia Cara

Rihanna

Katy Perry

Eminem

Designer Chainz

Kenny Chesney

Carrie Underwood

The Jackson 5

Vitamin String Quartet

The Beatles

Nell DeH8 Bowle

Destiny's Child

Phince

Englithe Rolling Stones

George Ezra

Depeche Mode The Smiths

Pantera

Marina and the Diamonds Molife Stripes MGMT THe Black Rege Against The Machine

Blur

Buste Bayresovs OutKast Dalt Punk

3 Dealer The Sevenfold

Simple Plan

Mayday Parade

Reinforcement Learning Example



Types of Machine Learning

We'll focus on this category

Supervised Learning

- labeled data
- learn relationships

Examples:

- spam detection
- •image classification

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- find data structure
- Examples:
- customer segmentation
- anomaly detection

Reinforcement Learning

- reward based
- find optimal strategy
- Examples:
- game playing
- autonomous driving



Google's Al Awakening

Sign in / Sign up



Jun Rekimoto : 暦本純一 Follow 人間とテクノロジーの未来を探求しています。 Nov 11, 2016 · 5 min read You seem to have made it into a neural network Try the beginning with The Great Gatsby Google Translate

ニューラルネット化したらしいGoogle翻訳でThe Great Gatsby冒頭 を試してみる:

原文:In my younger and more vulnerable years my father gave me some advice that I've been turning over in my mind ever since.

"Whenever you feel like criticizing any one," he told me, "just remember that all the people in this world haven't had the advantages that you've had."

google:私の若くて傷つきやすい年の頃、私の父は私が私の心の中でそれ 以来変わってきたアドバイスを私にくれました。

「誰かを批判する気持ちがあるときはいつでも、彼は私に言いました。 「この世界のすべての人々はあなたが持っていた優位性を持っていないこ とを覚えておいてください。 Ehe New York Eimes Magazine

The Great A.I. Awakening

How Google used artificial intelligence to transform Google Translate, one of its more popular services — and how machine learning is poised to reinvent computing itself.



Account ~



IS THIS A CAT of DOG?





Neural Networks

Teachable Machine

Train a computer to recognize your own images, sounds, & poses.

A fast, easy way to create machine learning models for your sites, apps, and more – no expertise or coding required.













Can a neural network learn to recognize doodling?

Help teach it by adding your drawings to the world's largest doodling <u>data set</u>, shared publicly to help with machine learning research.



Demo: Quick, Draw



Neural Network Training

- guess values
- improve guess
- repeat until "close enough"



Iteration = 100, Loss = 0.00031277

Coefficient	Target	Predicted
Coefficient 0	-0.5	-0.38080
Coefficient 1	0.8	0.78087
Coefficient 2	0.2	0.12938
Coefficient 3	-0.7	-0.69594

1

As you can see, the learned polynomial starts out following the initial curve, and fairly quickly moves to minimize the error between it and the target polynomial. The green dots you see are reminding you that we're using a discrete set of points to perform these calculations (the number of which you can vary in the appendix).





The MNIST Challenge



What's Happening

(

٠



784





Draw a digit by hand and have it classified in real time, as you draw, by a machine learning model trained against the MNIST dataset. The model used for this page is a convolutional neural network (CNN) built using Keras/TensorFlow on a Google Tensor Processing Unit (TPU). It's explained in depth and is available for you to build for yourself at bit.ly/mco-mnist-lab).



TensorFlow.js + MNIST

Made with \forall by <u>Marc</u>.



Vetworks From the ground up 18:40	But what is a neural network? Chapter 1, Deep learning 3Blue1Brown • 17M views • 7 years ago	•
ines learn 20:33	Gradient descent, how neural networks learn Chapter 2, Deep learning 3Blue1Brown • 7.1M views • 7 years ago	:
pagation	What is backpropagation really doing? Chapter 3, Deep learning 3Blue1Brown • 4.6M views • 6 years ago	•
pagation ulus	Backpropagation calculus Chapter 4, Deep learning 3Blue1Brown • 2.9M views • 6 years ago	:
Inside an LLM 27:14	How large language models work, a visual intro to transformers Chapter 5, Deep Learning 3Blue1Brown • 3.3M views • 6 months ago	:
	Attention in transformers, visually explained Chapter 6, Deep Learning 3Blue1Brown • 1.7M views • 6 months ago	:

000

26:10

Use of Deep Learning at Google

source directories containing deep learning models



Unique project directories

Time

Industry Adoption



ML Arxiv Papers — Moore's Law growth rate (2x/2 years)

Relative to 2009 ML Arxiv Papers

Year

Embeddings (The secret sauce of deep learning)

Recommending Al Books



Beginner





Better: 2-D Coordinate System



Beginner



Technical



Advanced



Conceptual

Even better: use N-dimensions

- Neural networks choose the dimensions for us.
- Based on the labelled training data (think "cat" vs. "dog"), neural networks are able to "embed" objects (words, images, video, audio) into N-dimensional space.
- We can represent embeddings as vectors:
 [a0, a1, a2, ..., aN]
- Similar objects get embedded in similar locations,
- This gives us the ability to do semantic search, i.e., find things that have similar meaning.

Embeddings In Action



An Intuitive Guide to How LLMs Work



AI

Chatting by chance

OCTOBER 6, 2024





Coin Flip

Roulette Wheel



Conditional Distribution





77 66 HAR R 77 (IMPROVISERS / GET PERSON

Diffusion Models

Forward diffusion noisy image



image



noise





Diffusion Models






Imagine 3m



Show how diffusion models take a random noisy image and iteratively convert them into a clear image guided by a text prompt

v 6.1



State of the Art

Pr

Search for p

Examples: MEN

See search help

Congratulatio

AlphaFold DB provides open access to over 200 million protein structure predictions to accelerate scientific research.

	Alnha	Fold			
otein	Struct	Ire	Da	taha	Se
Develo	ped by Google Dee	pMind an	d EMBL	-EBI	
rotein, gene, UniPro	ot accession or organisn	n or sequenc	e search	BETA	Search
NFQKVEKIGEGTYGV	Free fatty acid receptor 2	At1g58602	Q5VSL9	E. coli	
→ Go to online cou	urse →	See our	updates – S	eptember 2024	
ons to Demis Hassabis	, John Jumper and David Ba	ker on winning	the 2024 N	obel Prize in Cher	nistry!



What can I help with?





Brainstorm	Code Q Make a	a plan More	

Does that look familiar?



Q

Google Search

U .

I'm Feeling Lucky





I want to build a live demo of a Turing test where I start two parallel chat dialogs with a human and with ChatGPT. The human should be able to participate from their own laptop in another location. The two dialogs should be displayed in parallel but it should not be obvious which is talking to the human and which is talking to ChatGPT. Can you write that app for me?



get started.

Tech Stack:

- Backend: Node.js with Express (for real-time communication)
- Frontend: HTML/CSS/JavaScript (for chat interface)
- AI Model: ChatGPT API (via OpenAI API)
- Database (optional): You could use MongoDB or Firebase for logging the chat conversations, but this is optional.

Building a live demo of a Turing test with two parallel chat dialogs (one with a human and one with ChatGPT) requires a real-time chat application with a user-friendly interface. Below is an outline of how you could create this app, along with some code samples to help you

• WebSocket: Socket.IO (to handle real-time messaging between the server, the human participant, and the client performing the test)





•••

~/p/turing\$ ls —l total 72 -rw-r-r-r-@ 1 mco staff 11357 Oct 15 14:00 LICENSE -rw-r--r--@ 1 mco staff -rw-r--r--@ 1 mco staff -rw-r--r--@ 1 mco staff -rw-r-r--@ 1 mco staff -rw-r-r-r-@ 1 mco staff 14 Oct 15 14:12 run.sh -rwxr-xr-x@ 1 mco staff ~/p/turing\$ ~/p/turing\$ wc -l * 201 LICENSE 2 README.md 73 app.py 55 human.html

```
74 index.html
```

```
1 run.sh
```

```
1 setup.sh
```

```
407 total
```

~/p/turing\$

```
71 Oct 15 14:00 README.md
  2405 Oct 15 14:12 app.py
  1286 Oct 15 14:13 human.html
 1928 Oct 15 14:13 index.html
42 Oct 15 14:11 setup.sh
```



How the pros do it

GITHUB COPILOT: CHAT
🧑 monalisa
Write unit tests for this function
B GitHub Copilot
import unittest
import datetime
class TestParseExpenses(unittest.TestCase):
<pre>def test_parse_expenses_with_valid_input(self):</pre>
expenses_string = '2023-01-02 -34.01 USD\n2023-01-
<pre>expected_output = [(datetime.datetime(2023, 1, 2)</pre>
<pre>self.assertEqual(parse_expenses(expenses_string),</pre>
def test parse expenses with empty input(self):
expenses_string = ''
expected_output = []
<pre>self.assertEqual(parse_expenses(expenses_string),</pre>
if name == ' main ':
unittest.main()
The code assumes that the datetime module is imported. The test
cases cover different scenarios such as valid input, empty input, input
with comments, invalid date format, and invalid value format.





Stanford University

Stanford School of Humanities and Sciences

Prospective Students

Study finds ChatGPT's latest bot behaves like humans, only better

The most recent version of ChatGPT passes a rigorous Turing test, diverging from average human behavior chiefly to be more cooperative.

FEBRUARY 22, 2024



Text to Image - Midjourney



What will you imagine?

Random Hot Top Day ~ Likes



? Help

• Light Mode

\$ \$

Q Search



Text to Speech - <u>ElevenLabs</u>

Text to Music - Google's MusicFx



Text to Audio - NotebookLM

NotebookLM EXPERIMENT Do your best orainstorming

NotebookLM is your personalized AI research assistant powered by Google's most capable model, Gemini 1.5 Pro.

Try NotebookLM





"Make the kid in this photo come alive and dance a little dance"

Text to Video - <u>Runway</u>







SILVER AI FILM FESTIVAL 2024



Gemini -



summarize this video: https://www.youtube.com/watch?v=UvObKRaxZ_Q

YouTube 🗸

This video is about the privacy threats of artificial intelligence (AI).

AI is being used to collect and track people's data. This data is then used for targeted advertising, identity theft, and other malicious purposes. The Biden Administration has recently unveiled a blueprint for an AI Bill of Rights to protect people's personal data and limit surveillance.

Cybersecurity analyst Julio Rivera believes that AI poses a serious threat to privacy. He says that people are living online and opting into data collection without realizing the risks. He also says that the government is collecting data on people's conversations and monitoring their homes.

The AI Bill of Rights has five core principles: safe and effective systems, prevention of algorithmic discrimination, data privacy, proper notice and explanation, and alternative options. Rivera believes that the bill is a good start but that it needs to be implemented carefully. He also warns that AI will continue to evolve and that there will be new threats to privacy in the years ahead.



+ Try Gemini Advanced Gemini was just updated. <u>See update</u> ×

> Regenerate draft C

The Dream: Multimedia to Multimedia

September 25, 2023 ChatGPT can now see, hear, and speak



hese clouds are caused by 🔵







.... ALPHAGO HILL VALLEY Official Selection











AlphaZero





AlphaFold

AlphaFold is Open Source

https://github.com/google-deepmind/alphafold

Al Advances in Medicine

- Improved disease screening
- Enhanced diagnostic imaging
- Drug discovery and development
- Medical document transcription
- Predictive modeling

g ng pment

Unexpected Discoveries



Image of retina



Blood pressure predictions focus on blood vessels



accuracy in cancer detection and approaches across 15 datasets containing 11 cancer types.

CHIEF achieved nearly 94 percent significantly outperformed current AI





objects, walls, and other agents

STATE OF AL REPORT October 10, 2024 Nathan Benaich AIR STREET CAPITAL

stateof.ai

airstreet.com

Ethics

Using Al Safely



"With great power comes great responsibility"



Discussion topic: What are some of your concerns about AI?



- **Privacy & Surveillance**
- **Bias & Fairness**
- Misinformation & Disinformation
- Military use of Al
- Economic Impact
- Environmental Impact
- Copyright Protection



- "If you're not paying for it, you're the product".
- Your Al interactions are being used just like your web searches.
- How many times have you read the terms & conditions?
- Facial recognition is widely used in the UK without your consent.
- Legislators and companies are working on regulation but progress is much slower than technological advances.
- New privacy threats are emerging every day.
- IMO, companies cannot be trusted to self-govern.

Privacy & Surveillance




Privacy & Surveillance



Bias & Fairness

- This revolution is built by mostly young, college educated, white men living in Northern California.
- ML models are a direct reflection of their training data.
- Al propagates unconscious bias.

A father and his son are in a car accident. The father dies. The son is rushed to the ER. The attending surgeon looks at the boy and says, "I can't operate on this boy. He's my son!" How can this be?

Misinformation & Disinformation

- It's easier than ever to lie.
- Deepfakes are a particularly alarming development.
- This poses serious threats to democracy and is increasingly being weaponized.
- Education is critically important.
- Can we use AI to counter these threats?
- Example: <u>fullfact.org</u>
- Why are efforts like Full Fact so underfunded?

- Al is being used to process battlefield data, target individuals, and make real time decisions.
- Al is beginning to be used in autonomous weapons.
- Companies cannot be trusted to self-govern.
- Example: Google's <u>Project Nimbus</u>
- Somehow doesn't contradict Google's AI Principles



Employment Impact

- Will most employees become obsolete?
- Innovation has always done this but AI takes it to a new level.
- There will undoubtedly be massive job losses, but also many new opportunities.
- Knowing how to leverage AI will be one of those opportunities.
- Example: software engineers => systems engineers
- People will be need to operate at a higher level of abstraction

"As an employee, you're not paid to 'know x', or 'write programs', you're paid to be useful." - Ian Miell

Environmental Impact

- Globally, Al-related infrastructure consumes six times more water than Denmark.



Carbon footprint of training one deep learning model same as the lifetime emission of 5 cars. Computation required to train the most advanced AI models doubles every 3.4 months. Chips that power AI require rare earth elements, mined in environmentally destructive ways.

The Washington Post

Business of Climate Work Technology

Amazon doubles down on nuclear energy with

The cloud computing and retail giant signed a deal to buy electricity generated by small modular nuclear reactors.



Copyright Protection

- How will it work in the Al era?
- Al companies are getting a free ride.
- Did you get your ChatGPT royalty check for your blog articles?
- My opinion: companies should have to license everything they train with.

The Times Sues OpenAI and Microsoft Over A.I. Use of Copyrighted Work

Millions of articles from The New York Times were used to train chatbots that now compete with it, the lawsuit said.



- US: <u>Blueprint for an Al Bill of Rights</u>
- EU: Artificial intelligence act

NotebookLM:

Both the US and EU are taking steps to regulate AI, albeit with different approaches. The US Blueprint focuses on setting ethical guidelines and promoting responsible AI development, while the EU AI Act establishes legally binding rules with a stronger focus on enforcement. These frameworks highlight the growing global recognition of the need to govern AI development and use to protect individual rights and ensure its societal benefits are realized.

Al Regulation



The Future

Where is all this going?





- **1. Are language models intelligent?**
- 2. Can humans be trusted with this tool? How should we manage this technology?
- 3. Is Al a net good for society?
- 4. Are we doomed?

Discussion: Four Questions

My Answers

1. Are language models intelligent? • Yes. These models "understand" things.

- How do we understand things?

2. Can humans be trusted with this tool?

Clearly not. But stopping the train is unrealistic.

3. Is Al a net good for society?

- All tools are neutral. It's how we use them that matters.
- Nothing new about humans using tools for bad purposes.
- The solution to most problems is education.

4. Are we doomed?

- Possibly, but given my answer to 1, I'm not sure that's all bad. :)
- <u>Geoff Hinton's view</u>

• We've been on this path for a while (internet, smart phones, social media).



"There are very few examples of more intelligent things being controlled by less intelligent things"

- Geoff Hinton



Recommended Listening



What are the biggest risks associated with the AI revolution?



Navigating Change

- high level languages
- portable operating systems
- Moore's Law
- PC proliferation
- the internet
- the web
- smart phones
- the cloud
- data science boom
- ML & Al







Ok, but how?

Be curious



Be open to opportunity





Be a lifelong learner



Be intentional (make plans!)

Photo by <u>Glenn Carstens-Peters</u> on <u>Unsplash</u>



This is for everyone









https://bit.ly/citylit-ai-eval

Feedback