

# Machine Learning Opens Up New Ways to Help Disabled People

Kaiyuan Chen  
May 23, 2017

# Keywords



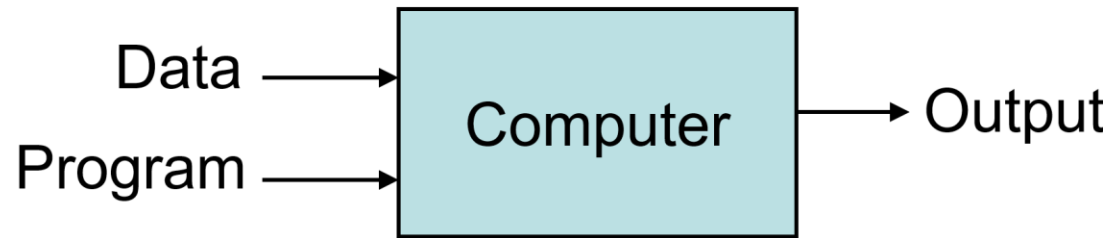
# Machine learning

People are taking about it

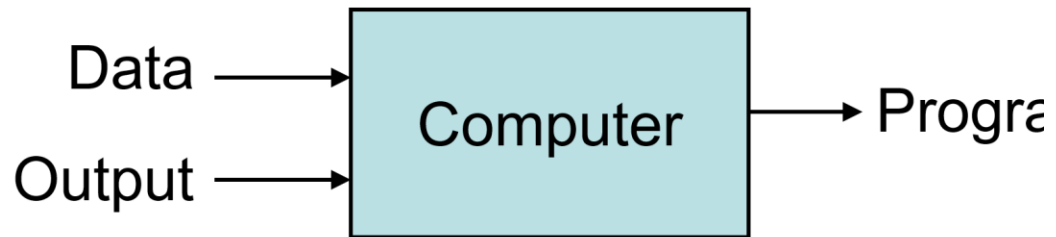
Machine learning gives computers the ability to learn without being explicitly programmed.

-Arthur Samuel, 1959

## Traditional Programming



## Machine Learning



From  
Data  
To  
Model

# Components

- ▶ Tens of thousands of machine learning algorithms
- ▶ Hundreds new every year
- ▶ Every machine learning algorithm has three components:
  - ▶ Representation
  - ▶ Evaluation
  - ▶ Optimization

# Representation

- ▶ Decision trees
- ▶ Sets of rules / Logic programs
- ▶ Instances
- ▶ Graphical models (Bayes/Markov nets)
- ▶ Neural networks
- ▶ Support vector machines
- ▶ Model ensembles
- ▶ Etc.

# Evaluation

- ▶ Accuracy
- ▶ Precision and recall
- ▶ Squared error
- ▶ Likelihood
- ▶ Posterior probability
- ▶ Cost / Utility
- ▶ Margin
- ▶ Entropy
- ▶ K-L divergence
- ▶ Etc.



# Optimization

- ▶ Combinatorial optimization
  - ▶ E.g.: Greedy search
- ▶ Convex optimization
  - ▶ E.g.: Gradient descent
- ▶ Constrained optimization
  - ▶ E.g.: Linear programming

# Machine Learning

- ▶ Representation
- ▶ Evaluation
- ▶ Optimization

# Accessibility

When we have a hammer

< General Accessibility

VISION

VoiceOver Off >

Zoom Off >

Magnifier Off >

Display Accommodations Off >

Speech >

Larger Text Off >

Bold Text ☐

Button Shapes ☐

Increase Contrast >

Reduce Motion Off >

On/Off Labels ☐

General Accessibility

On/Off Labels

INTERACTION

Switch Control Off

AssistiveTouch On

Touch Accommodations Off

Keyboard

Shake to Undo On

Vibration On

Call Audio Routing Automatic

Home Button

Reachability

Double-tap the home button to bring the top of the screen into reach.

HEARING

[General](#) Accessibility

HEARING

Hearing Devices >

TTY Off >

LED Flash for Alerts Off >

Mono Audio ☐

Phone Noise Cancellation ☒

Noise cancellation reduces ambient noise on phone calls when you are holding the receiver to your ear.



Adjust the audio volume balance between left and right channels.

MEDIA

Subtitles & Captioning >

Audio Descriptions Off >

# New ways

YouTube, Facebook, IBM ...

What do they do?

Visualizing Sound Effects

YouTube



# Visualizing Sound Effects

- ▶ Captions - Ten years ago
- ▶ Then Automated Captions



# Visualizing Sound Effects

- ▶ [APPLAUSE]
- ▶ [MUSIC]
- ▶ [LAUGHTER]





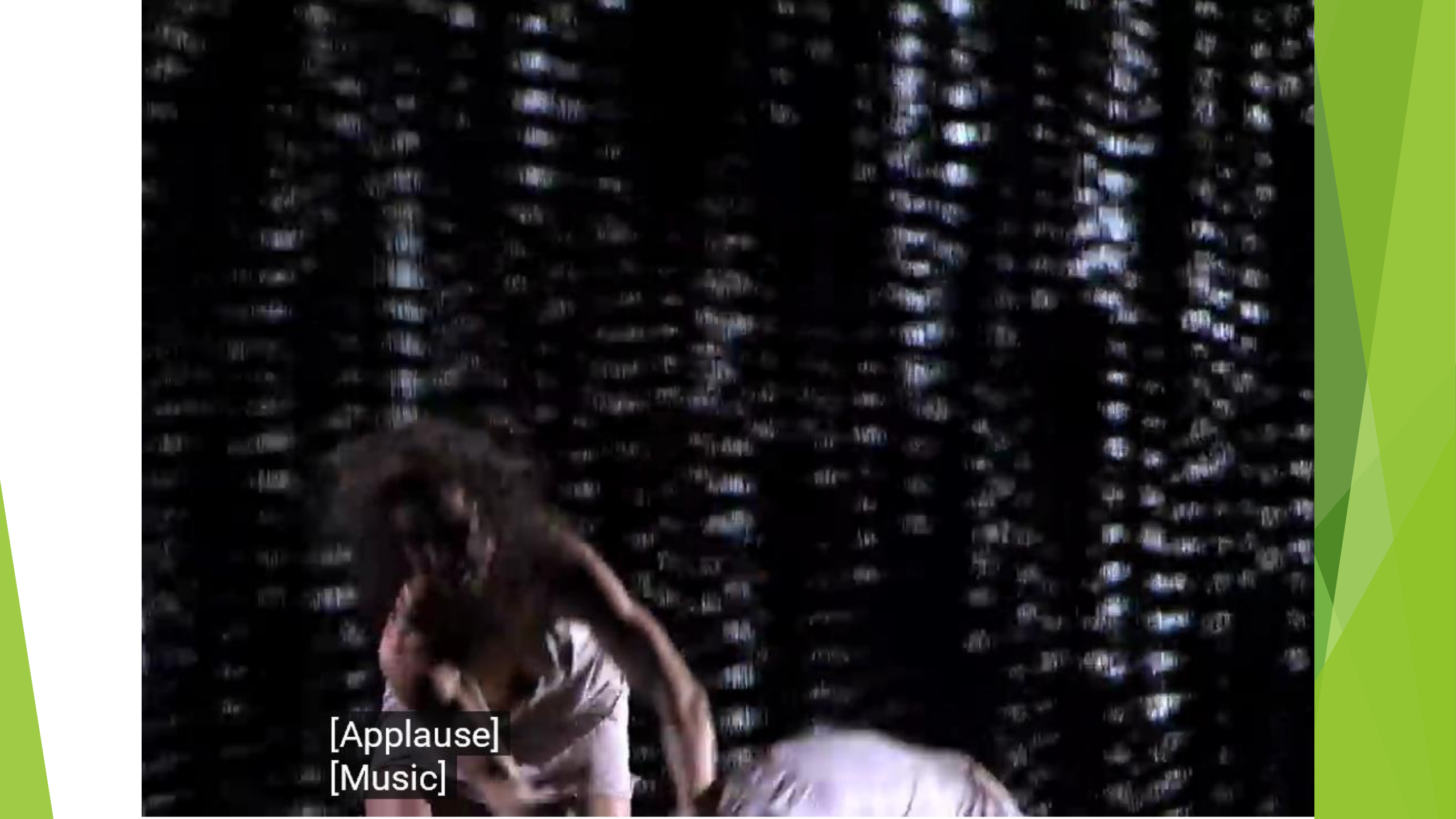


[Music]



[Applause]  
[Music]



A person with dark hair, wearing a white short-sleeved shirt, is captured in a deep bow on a stage. Their arms are extended forward, and their head is tucked down. The background is filled with a large, out-of-focus crowd of people, mostly men, seated in rows. The lighting is dim, with some highlights on the audience members' heads and shoulders. The overall atmosphere suggests a formal event or performance.

[Applause]  
[Music]

“Machine learning is giving people like me that need accommodation in some situations the same independence as others”

-Liat Kaver, a product manager at YouTube who is deaf.



The background features abstract, overlapping green geometric shapes, primarily triangles and polygons, in various shades of green, creating a modern, layered effect on the right side of the slide.

# 1, 000, 000, 000

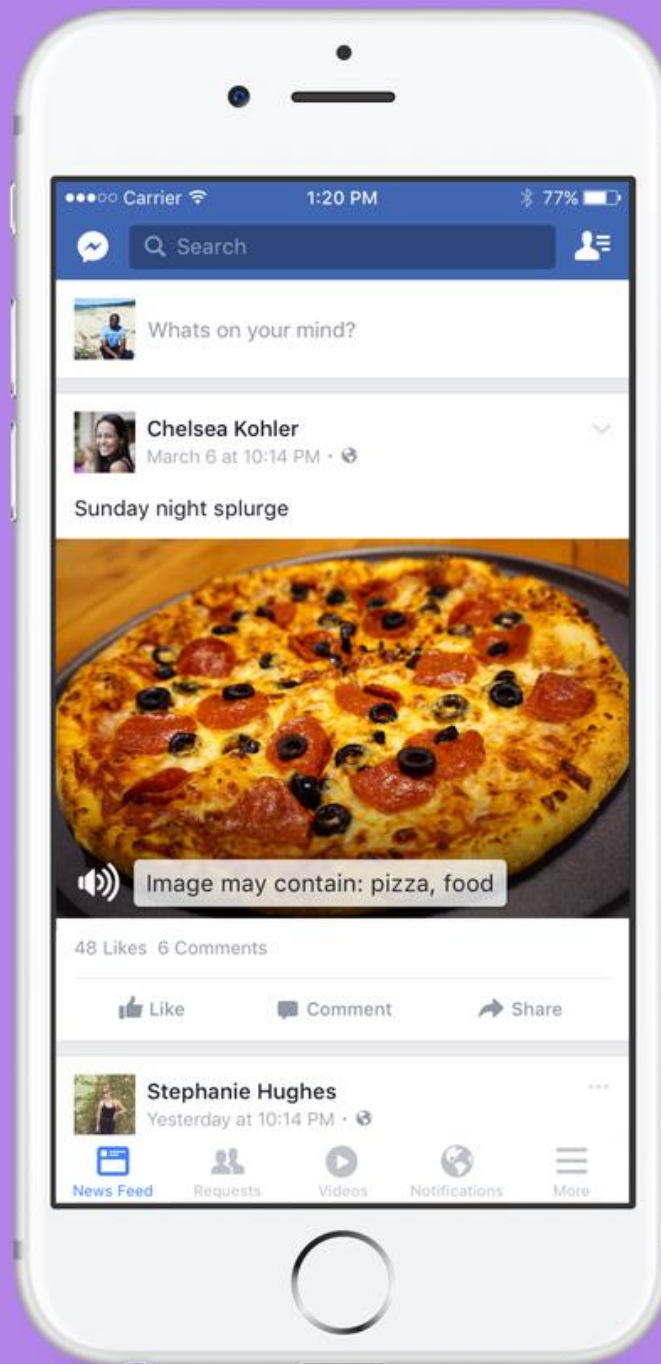
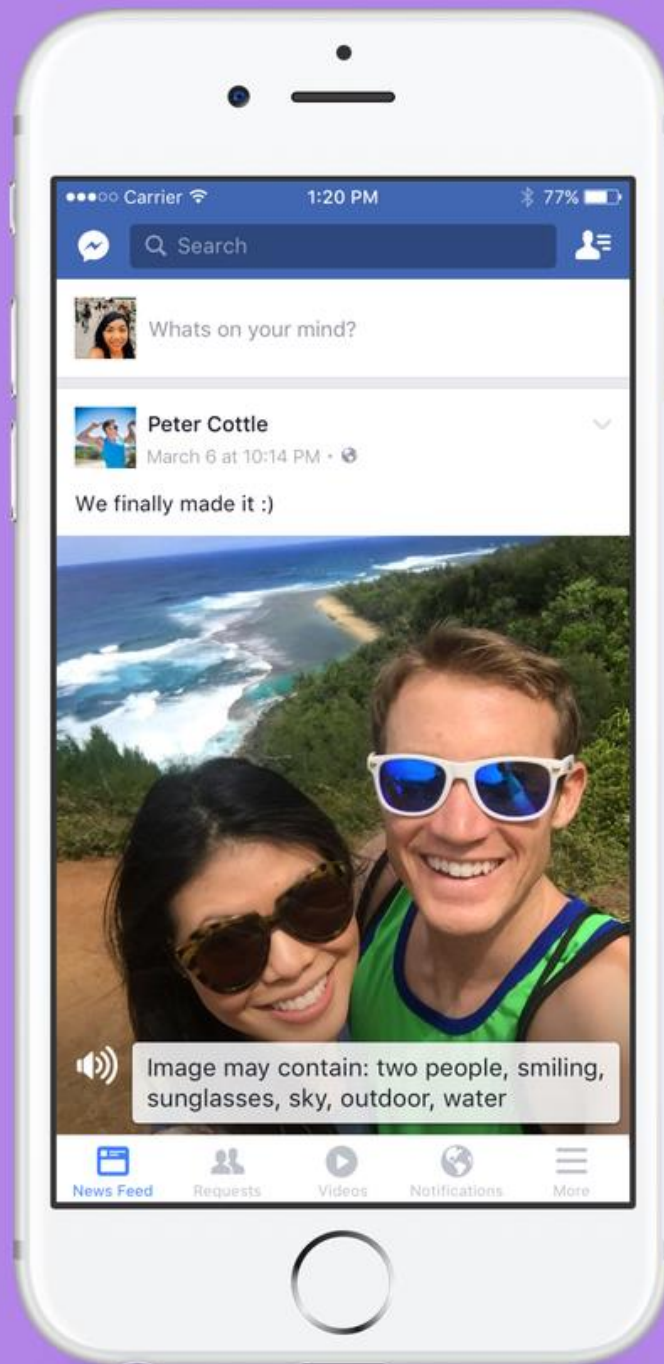
accuracy close to human ears

# Prospect for YouTube

- ▶ Interpreting sound, music, text
- ▶ ads, search, cloud computing

Image Recognition

Facebook





## Search by image



Search Google with an image instead of text. Try dragging an image here.

**Paste image URL**

**Upload an image** ?

Browse...





conifer cone



All

**Images**

Maps

Shopping

More

Settings

Tools

About 2 results (0.77 seconds)



Image size:  
5520 × 3680

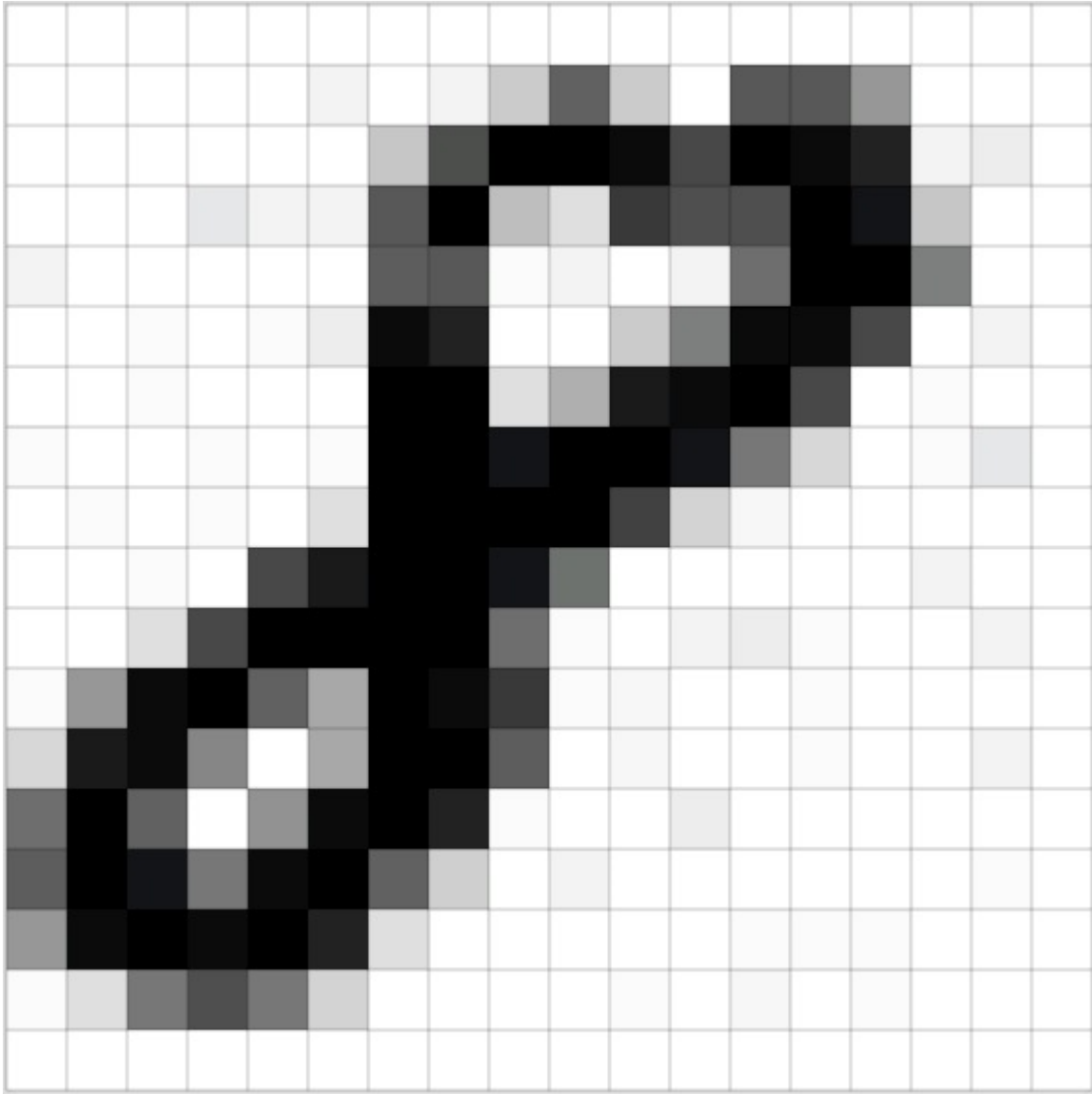
No other sizes of this image found.

Best guess for this image: **conifer cone**

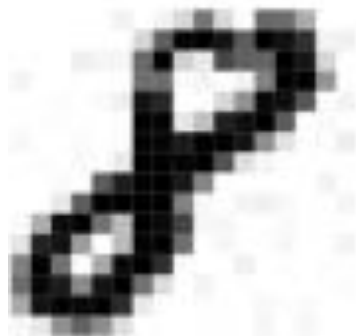
## Conifer cone - Wikipedia

[https://en.wikipedia.org/wiki/Conifer\\_cone](https://en.wikipedia.org/wiki/Conifer_cone) ▼

A **cone** is an organ on plants in the division Pinophyta (conifers) that contains the reproductive structures The familiar woody **cone** is the female **cone**, which ...

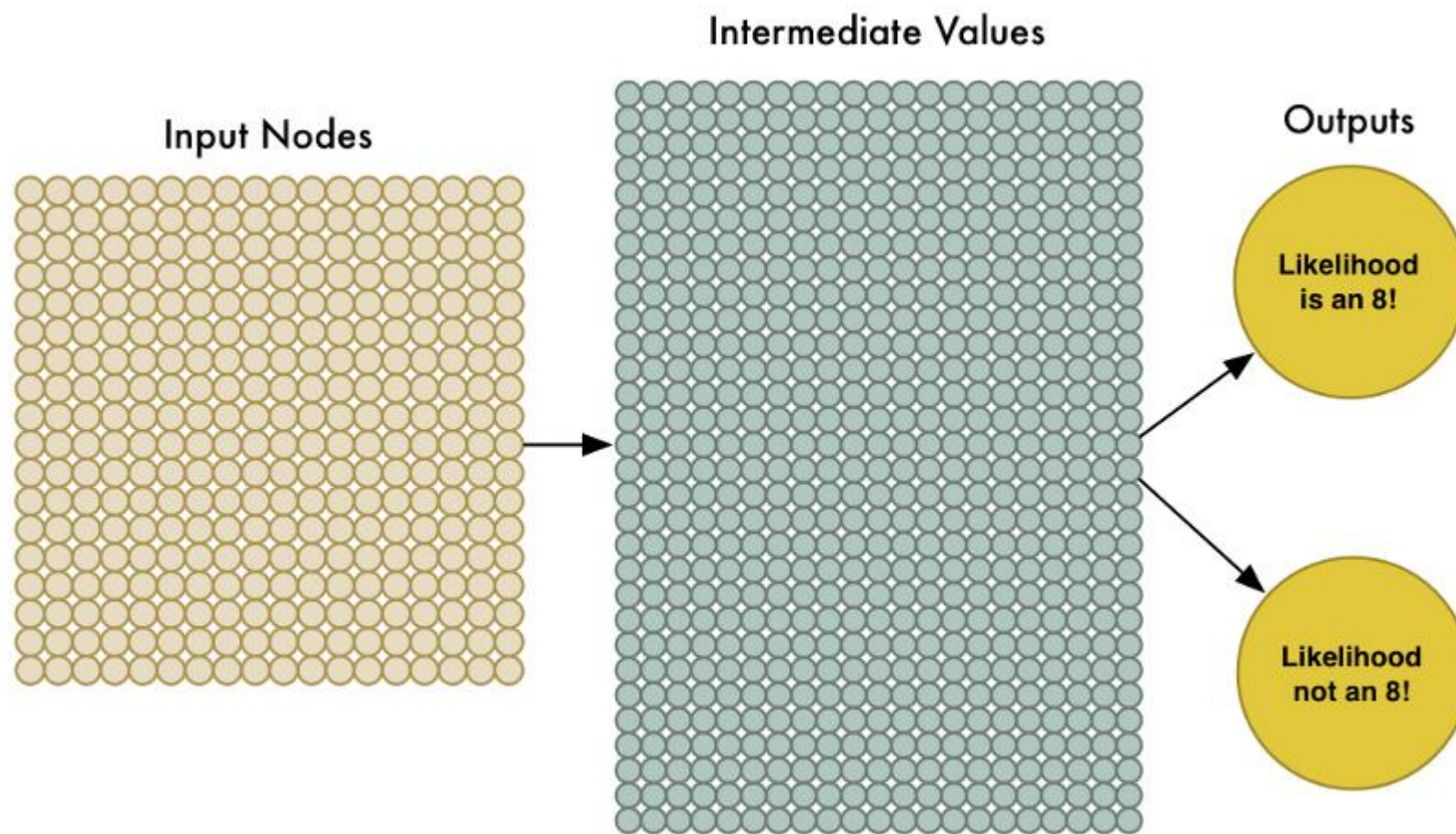






=

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5	0	7	8	7	8	6	9	2	3	8	8	6	5	1	1	3	2	6	0	6	0

Train data set

Test  
Image #1



Prediction from  
our network

100% an "8"!

Test  
Image #2



Prediction from  
our network

100% not an "8"!

Results

Test Image #1



Prediction from  
our network

100% an "8"!

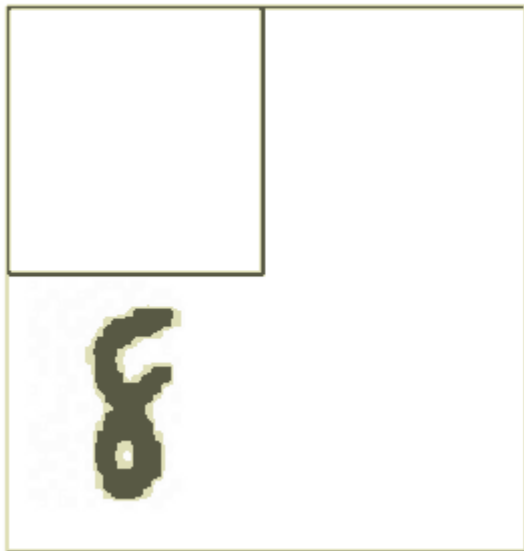
Test Image #2



Prediction from  
our network

100% not an "8"!

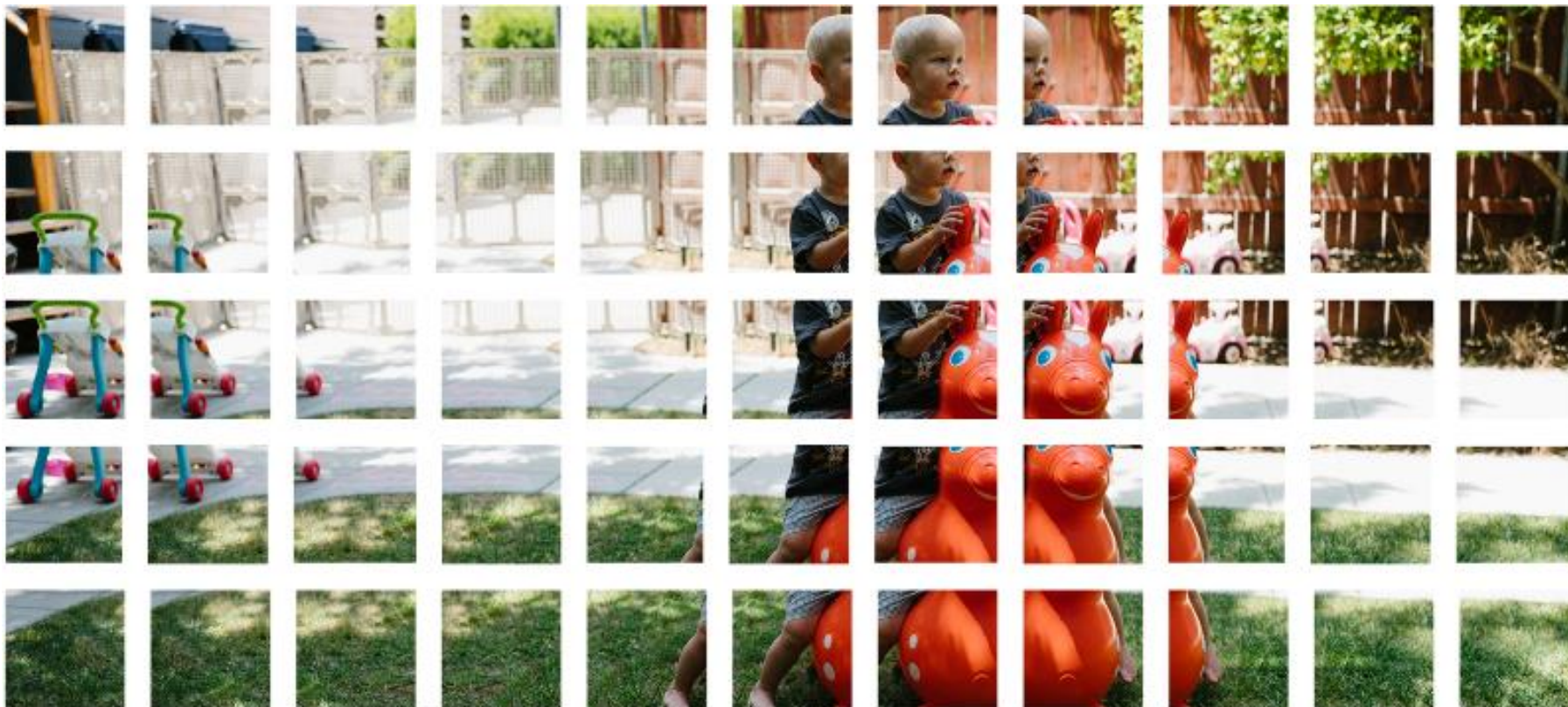
Test Image



Prediction from  
our network

No idea!?!





More Generally

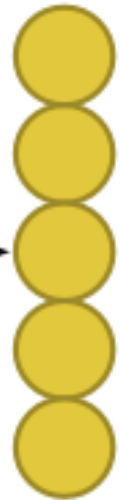
## Processing a single tile

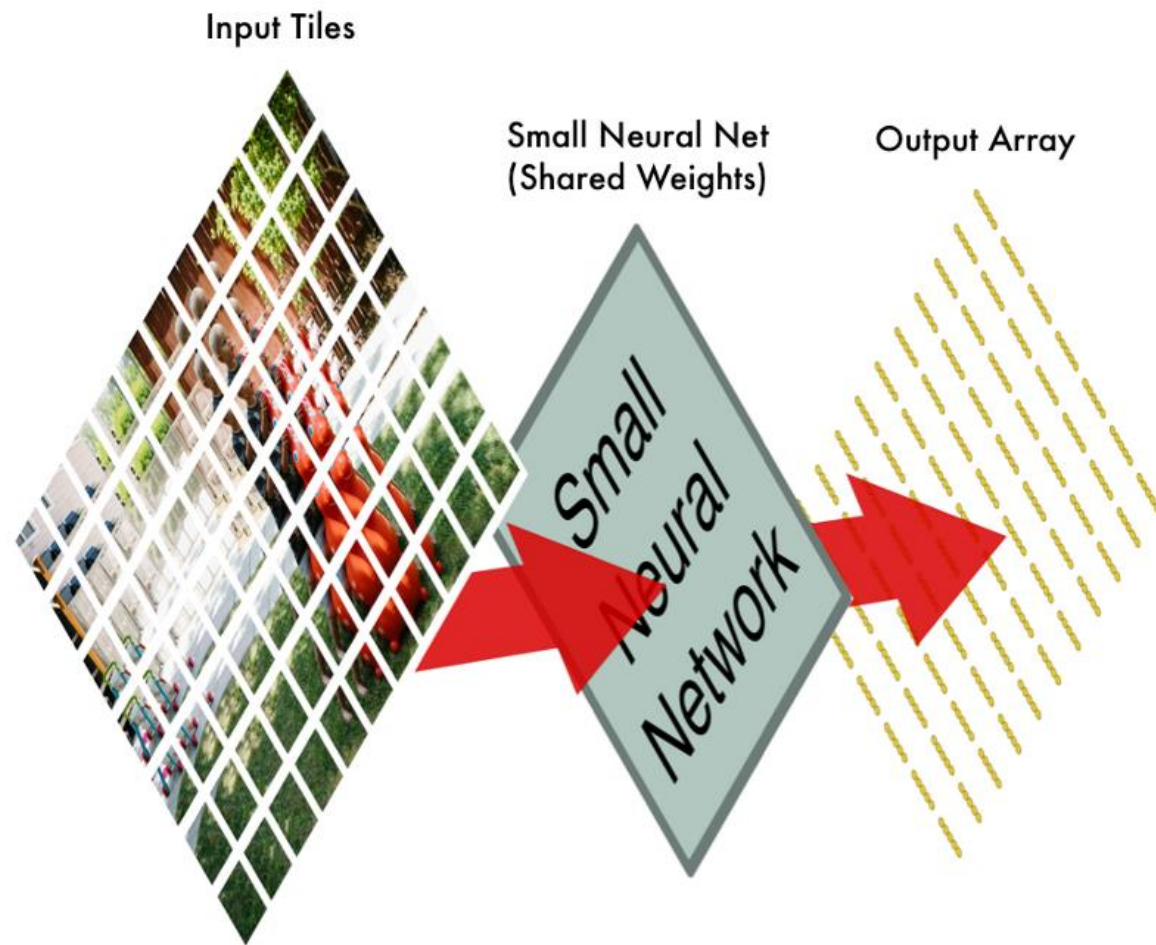
Input Tile



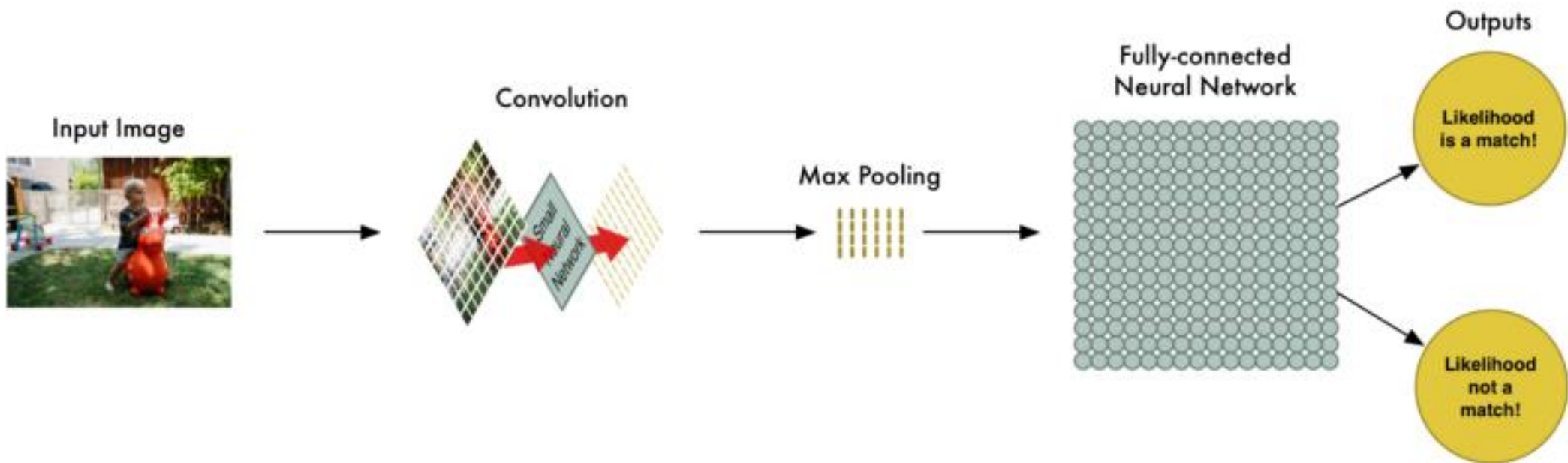
Small  
Neural  
Network

Outputs









Get the result

IBM  
EU Project

# Text Simplification

# Who need it?

- ▶ Cognitive and intellectual disabilities
- ▶ autism or dementia
  - ▶ difficulty in **communicating** and forming relationships with other people and in using **language and abstract concepts**
  - ▶ disorder of the mental processes caused by brain disease or injury and marked by **memory disorders, personality changes, and impaired reasoning.**

The background features abstract geometric shapes. A light green triangle is in the top-left corner. A darker green triangle is in the top-right corner. A yellow triangle is in the bottom-right corner. The central area is white.

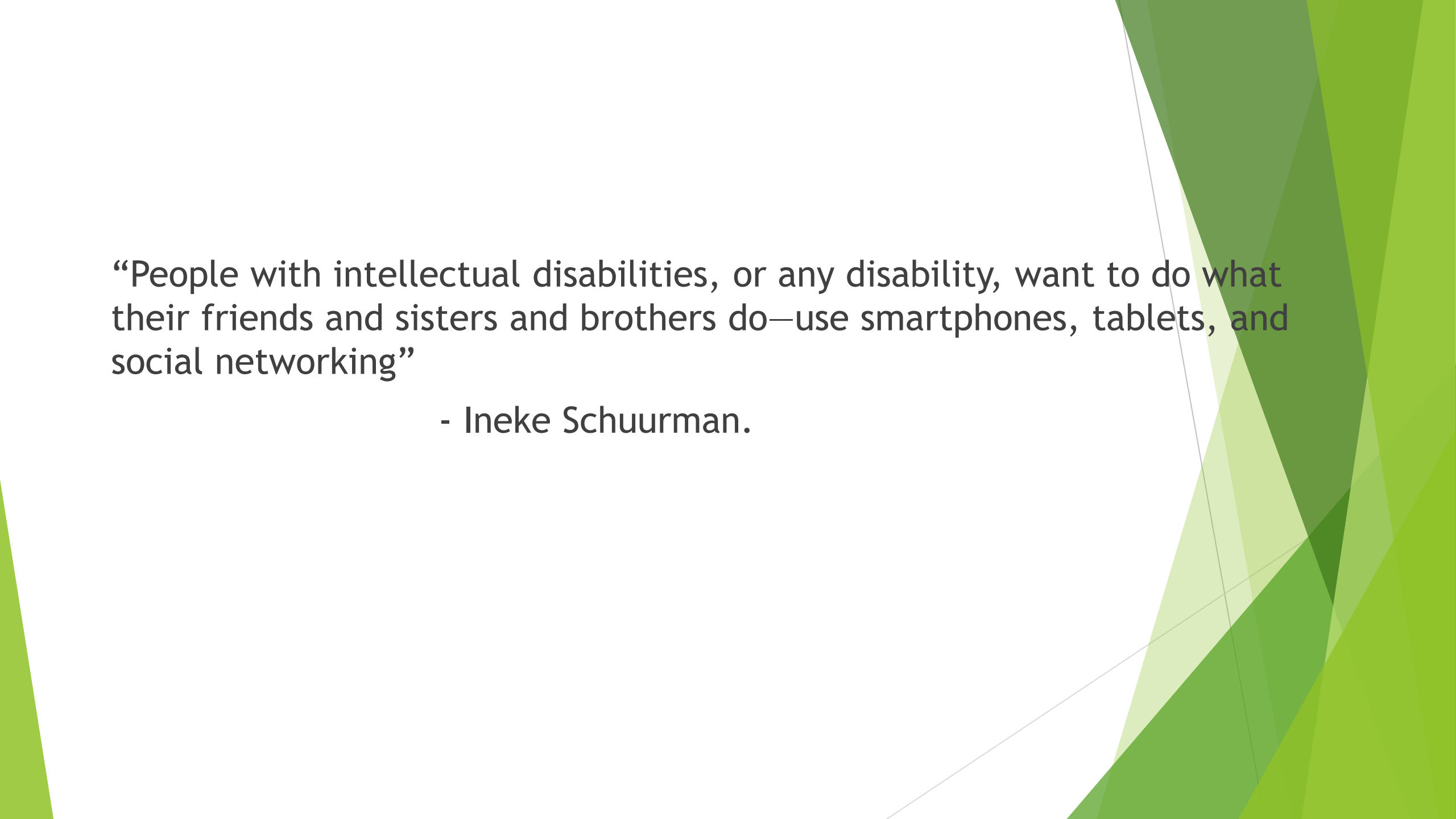
Raining cats and dogs

# IBM & MIT

- ▶ helps autistic high schoolers transition to college life
- ▶ to prevent some people from being left behind

# EU Project

- ▶ built into apps that integrate with Gmail and social networks such as Facebook

The background of the slide features abstract, overlapping green geometric shapes, primarily triangles and polygons, in various shades of green, creating a modern and dynamic visual effect.

“People with intellectual disabilities, or any disability, want to do what their friends and sisters and brothers do—use smartphones, tablets, and social networking”

- Ineke Schuurman.

# Problem

- ▶ A machine-learning algorithm recommending a movie you don't care for is one thing
- ▶ An error that causes you to misunderstand a friend is another.



We build things

# Works Cited

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- ▶ Geitgey, Adam. "Machine Learning Is Fun! Part 3: Deep Learning and Convolutional Neural Networks." *Medium*. 13 June 2016. Web. 18 May 2017.
- ▶ Simonite, Tom. "\*Applause\* YouTube's Caption Upgrade Shows How Machine Learning Is Helping the Disabled." *MIT Technology Review*. MIT Technology Review, 08 May 2017. Web. 11 May 2017.
- ▶ Simonite, Tom. "Experimental Facebook App Can Answer Questions About the Content of Photos." *MIT Technology Review*. MIT Technology Review, 16 Mar. 2016. Web. 11 May 2017.
- ▶ "Visualizing Sound Effects." *YouTube Engineering and Developers Blog*. 23 Mar. 2017. Web. 11 May 2017.

The background is a solid light green color. On the right side, there are several overlapping, semi-transparent geometric shapes in various shades of green, creating a modern, abstract design. A thin white line runs diagonally across the lower right portion of the image.

# Thank you

Kaiyuan Chen