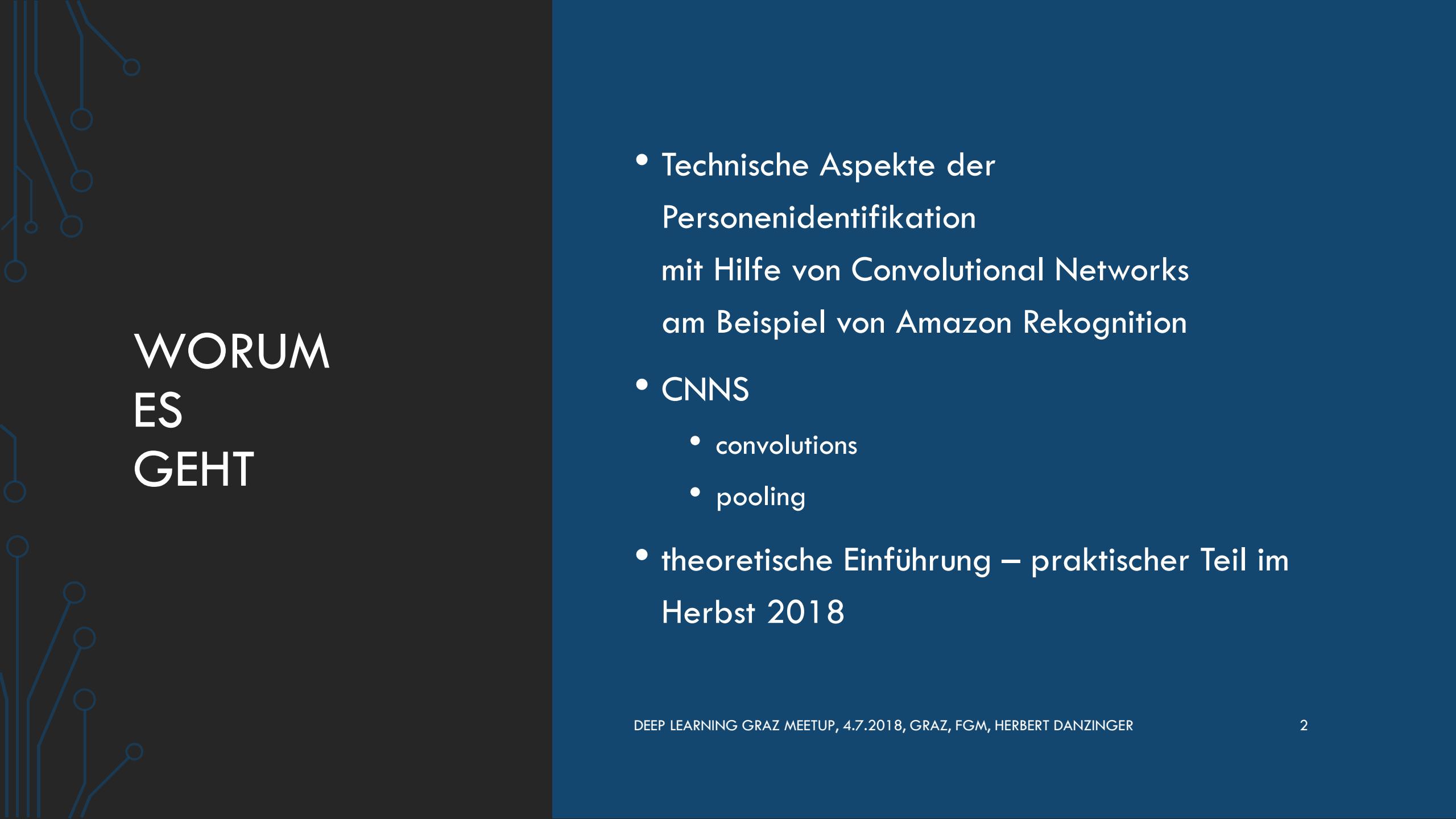


meetup

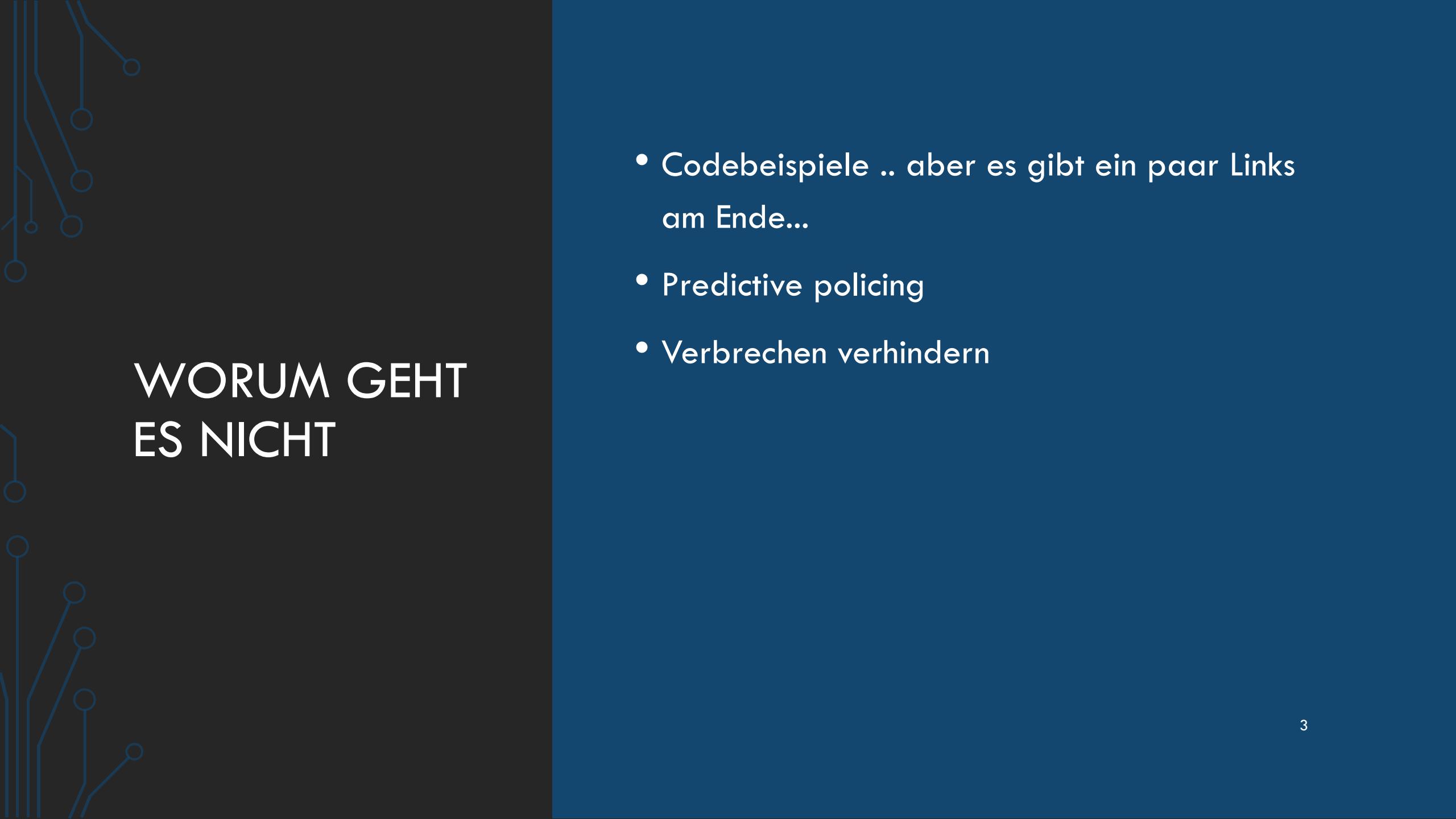


DEEP LEARNING GRAZ MEETUP, 4.7.2018, GRAZ, FGM, HERBERT DANZINGER



WORUM ES GEHT

- Technische Aspekte der Personenidentifikation mit Hilfe von Convolutional Networks am Beispiel von Amazon Rekognition
- CNNs
 - convolutions
 - pooling
- theoretische Einführung – praktischer Teil im Herbst 2018



WORUM GEHT ES NICHT

- Codebeispiele .. aber es gibt ein paar Links am Ende...
- Predictive policing
- Verbrechen verhindern

Amazon ermöglicht Live-Gesichtserkennung für ganze Städte

23.05.2018 08:37 Uhr – Daniel AJ Sokolov

vorlesen



(Bild: Kurt Bauschardt CC BY-SA 2.0)

[HTTPS://WWW.HEISE.DE/NEWSTICKER/MELDUNG/AMAZON-ERMOEGLICHT-LIVE-GESICHTSERKENNUNG-FUER-GANZE-STADETE-4055143.HTML](https://www.heise.de/newsticker/meldung/Amazon-ermöglicht-Live-Gesichtserkennung-für-ganze-Städte-4055143.html)

AMAZON RECOGNITION IN DEN MEDIEN

**ermöglicht,
ganze Städte in
Echtzeit zu
überwachen.**

**in den USA wird
Rekognition
bereits eingesetzt**

**US-Bürgerrechtler
(ACLU) fordern
ein Ende dieser
Überwachung.**

 Email address ZIP code

GET UPDATES

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Amazon Teams Up With Government to Deploy Dangerous New Facial Recognition Technology



Matt Cagle, Technology and Civil Liberties attorney, ACLU of Northern California & Nicole Ozer, Technology & Civil Liberties Director, ACLU of California

MAY 22, 2018 | 10:00 AM

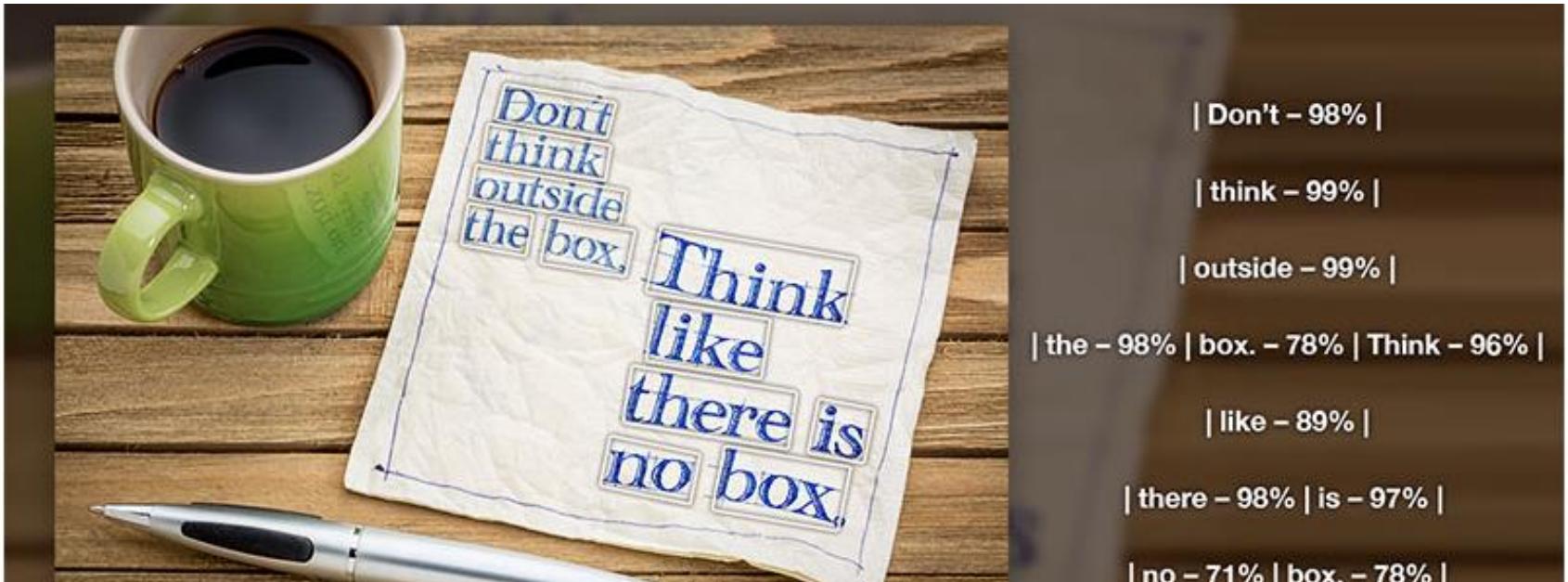
TAGS: [Face Recognition Technology](#), [Surveillance Technologies](#), [Privacy & Technology](#)



[HTTPS://WWW.ACLU.ORG/BLOG/PRIVACY-TECHNOLOGY/SURVEILLANCE-TECHNOLOGIES/AMAZON-TEAMS-GOVERNMENT-DEPLOY-DANGEROUS-NEW](https://www.aclu.org/blog/privacy-technology/surveillance-technologies/amazon-teams-government-deploy-dangerous-new)

FEATURES VON AMAZON REKOGNITION

[HTTPS://AWS.AMAZON.COM/DE/BLOGS/MACHINE-LEARNING/AMAZON-REKOGNITION-ANNOUNCES-REAL-TIME-FACE-RECOGNITION-SUPPORT-FOR-RECOGNITION-OF-TEXT-IN-IMAGE-AND-IMPROVED-FACE-DETECTION/](https://aws.amazon.com/de/blogs/machine-learning/amazon-rekognition-announces-real-time-face-recognition-support-for-recognition-of-text-in-image-and-improved-face-detection/)



TEXT IN IMAGE

[HTTPS://AWS.AMAZON.COM/DE/BLOGS/MACHINE-LEARNING/AMAZON-REKOGNITION-ANNOUNCES-REAL-TIME-FACE-RECOGNITION-SUPPORT-FOR-RECOGNITION-OF-TEXT-IN-IMAGE-AND-IMPROVED-FACE-DETECTION/](https://aws.amazon.com/de/blogs/machine-learning/amazon-rekognition-announces-real-time-face-recognition-support-for-recognition-of-text-in-image-and-improved-face-detection/)

Real-time Face Recognition

You can now perform real-time face searches against collections with tens of millions of faces. This represents a 5-10X reduction in search latency, while simultaneously allowing for collections that can store 10-20X more faces than before. For security and public safety applications, this update helps identify persons of interest against a collection of millions of faces in real-time, enabling use cases that require an immediate response.

The Washington County Sheriff's Office is the primary first responder for 911 calls from the citizens of Oregon. The office also provides support for crime prevention to other city police departments countywide. The Sheriff's Office has been using Amazon Rekognition over the past year to reduce the identification time of reported suspects from 2-3 days down to minutes and had apprehended their first suspect within a week by using their new system.

"These improvements allow deputies in the field to receive the response to searches in near real time. This allows them to get the information they need and take action quickly. Seconds saved in the field can make the difference in saving a life." – *Chris Adzima, Senior Systems Analyst for the Washington County Sheriff's Office.*

REAL TIME FACE RECOGNITION

CROWD MODE FACE DETECTION

Face Detection

Customers can also detect, analyze, and index up to 100 faces (up from 15) in a single image. With this improvement, you can accurately capture demographic information for all faces in group photos, crowded events, and public places such as airports and department stores.



- 100 Gesichter
- klassifiziert demographische Features (Alter, Geschlecht...)
- klassifiziert Stimmung

[HTTPS://AWS.AMAZON.COM/DE/BLOGS/MACHINE-LEARNING/AMAZON-REKOGNITION-ANNOUNCES-REAL-TIME-FACE-RECOGNITION-SUPPORT-FOR-RECOGNITION-OF-TEXT-IN-IMAGE-AND-IMPROVED-FACE-DETECTION/](https://aws.amazon.com/de/blogs/machine-learning/amazon-rekognition-announces-real-time-face-recognition-support-for-recognition-of-text-in-image-and-improved-face-detection/)

Tracking People

Amazon Rekognition Video can track people in videos and provide information such as:

- The location of the person in the video frame at the time they were tracked.
- Facial landmarks such as the position of the left eye, when detected.

Amazon Rekognition Video person tracking in stored videos is an asynchronous operation. To start the tracking of people in videos call [StartPersonTracking](#). Amazon Rekognition Video publishes the completion status of the video analysis to an Amazon Simple Notification Service topic. If the video analysis is successful, call [GetPersonTracking](#) to get results of the video analysis. For more information about calling Amazon Rekognition Video API operations, see [Calling Amazon Rekognition Video Operations](#).

The following procedure shows how to track people through a video stored in an Amazon S3 bucket. The example expands on the code in [Analyzing a Video Stored in an Amazon S3 Bucket with Java or Python \(SDK\)](#) which uses an Amazon Simple Queue Service queue to get the completion status of a video analysis request.

PERSON TRACKING

PERSON TRACKING CODE SAMPLE

```
def GetResultsPersons(self, jobId):
    maxResults = 10
    paginationToken = ''
    finished = False

    while finished == False:
        response = self.rek.get_person_tracking(JobId=jobId,
                                                MaxResults=maxResults,
                                                NextToken=paginationToken)

        print(response['VideoMetadata']['Codec'])
        print(str(response['VideoMetadata']['DurationMillis']))
        print(response['VideoMetadata']['Format'])
        print(response['VideoMetadata']['FrameRate'])

        for personDetection in response['Persons']:
            print('Index: ' + str(personDetection['Person']['Index']))
            print('Timestamp: ' + str(personDetection['Timestamp']))
            print()

        if 'NextToken' in response:
            paginationToken = response['NextToken']
        else:
            finished = True
```

PUBLIC „SAFETY“

ideos

iversal, ubiquitous, and essential



Media and
entertainment

*Video-on-demand
viewers are expected to
reach 209 million by
2021 globally*

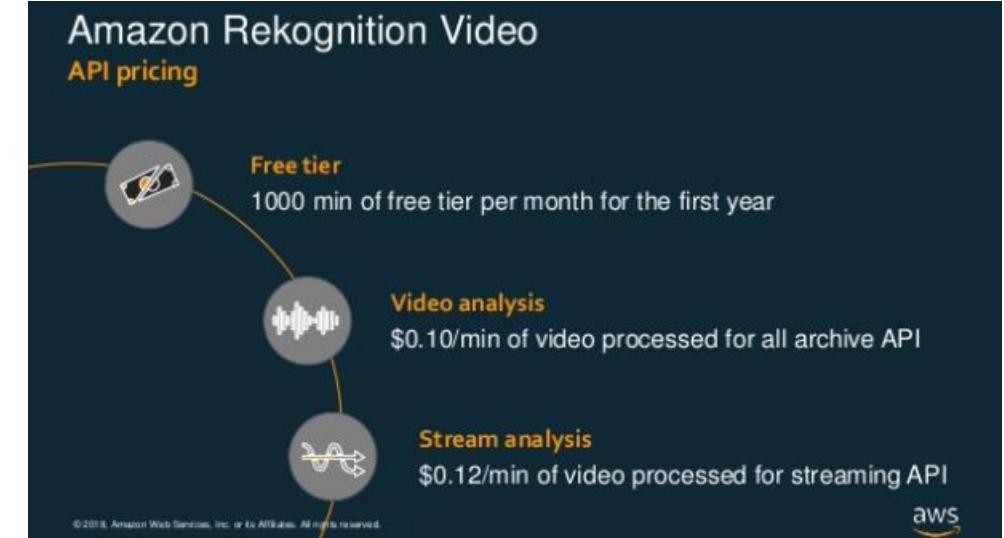


Public safety

*Expected to grow to
859 PB created/day*

© 2014, Amazon Web Services, Inc. or its Affiliates. All rights reserved.

WOS KOSTS?



[HTTPS://DE.SLIDEShare.NET/AMAZONWEBSERVICES/HOW-TO-GET-THE-MOST-OUT-OF-AMAZON-REKOGNITION-VIDEO-A-DEEP-LEARNING-BASED-VIDEO-ANALYSIS-SERVICE-AWS-ONLINE-TECH-TALK-TITLE](https://de.slideshare.net/amazonwebservices/how-to-get-the-most-out-of-amazon-rekognition-video-a-deep-learning-based-video-analysis-service-aws-online-tech-talk-title)



AMAZON: GET OUT OF THE SURVEILLANCE BUSINESS

[HTTPS://ACTION.ACLU.ORG/PETITION/AMAZON-STOP-SELLING-SURVEILLANCE](https://action.aclu.org/petition/amazon-stop-selling-surveillance)

SUPPORT THIS PETITION

59,731 Signed

75,000 Needed

To Amazon:

Get out of the business of providing Rekognition face recognition to the government. You're powering dangerous surveillance that threatens your customers and communities. Stop padding your bottom line by selling out our civil rights.

We call on you to:

- Stop selling facial recognition services to law enforcement
- Stop providing infrastructure to Palantir and any other Amazon partners who enable ICE.
- Implement strong transparency and accountability measures, that include enumerating which law enforcement agencies and companies supporting law enforcement agencies are using Amazon services, and how.

Our company should not be in the surveillance business; we should not be in the policing business; we should not be in the business of supporting those who monitor and oppress marginalized populations.

Sincerely,

Amazonians

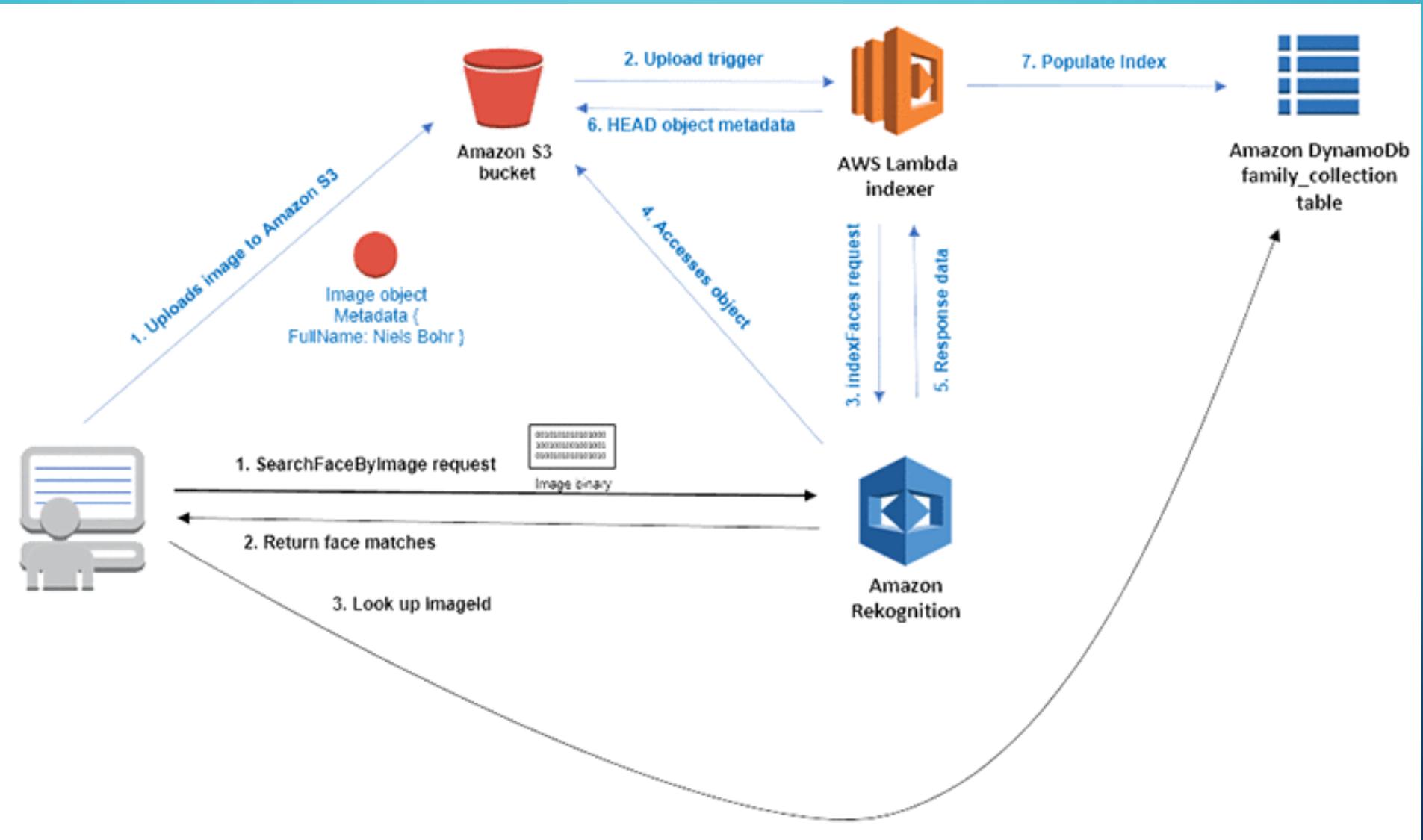
[HTTPS://GIZMODO.COM/AMAZON-WORKERS-DEMAND-JEFF-BEZOS-CANCEL-FACE-RECOGNITION-1827037509](https://gizmodo.com/amazon-workers-demand-jeff-bezos-cancel-face-recognition-1827037509)

Orlando Pulls the Plug on Its Amazon Facial Recognition Program



Amazon says its facial recognition technology can track people in a video even when their faces are not visible. Orlando, Fla., where the Police Department was using the system in a pilot program, let its contract with Amazon expire. Amazon

WIE FUNKTIONIERT AMAZON REKOGNITION?



[HTTPS://AWS.AMAZON.COM/DE/BLOGS/MACHINE-LEARNING/BUILD-YOUR-OWN-FACE-RECOGNITION-SERVICE-USING-AMAZON-REKOGNITION/](https://aws.amazon.com/de/blogs/machine-learning/build-your-own-face-recognition-service-using-amazon-rekognition/)

HINTER DEN KULISSEN

Convolutional
Neural
Net

Objectdetection

Objectidentification

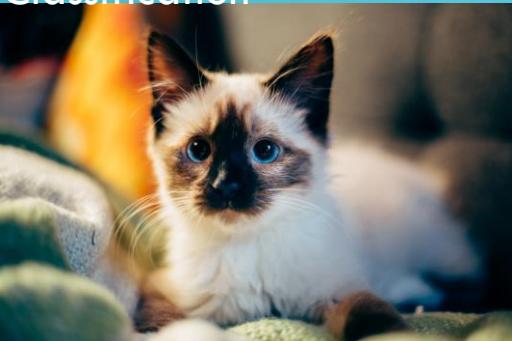


CNNs

COMPUTER VISION PROBLEME

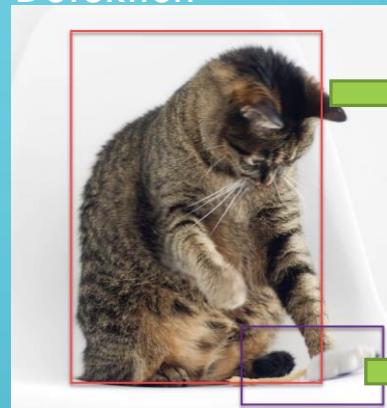
COMPUTER VISION PROBLEME

Classification



Katze?

Detektion



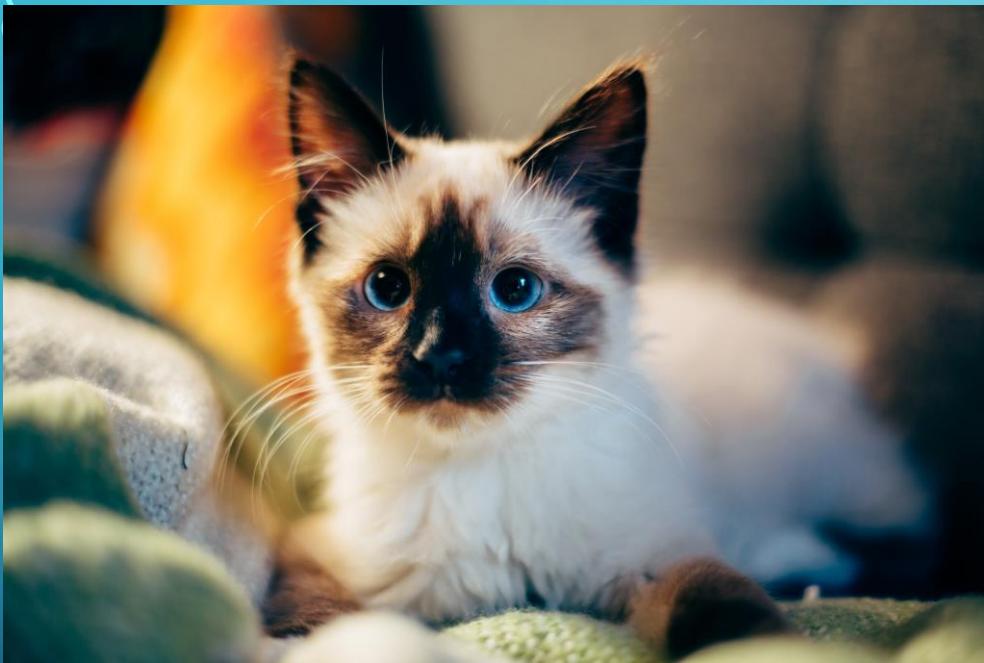
Katze ($x=0.2, y=0.1$)

Klassifikation + Lokalisierung

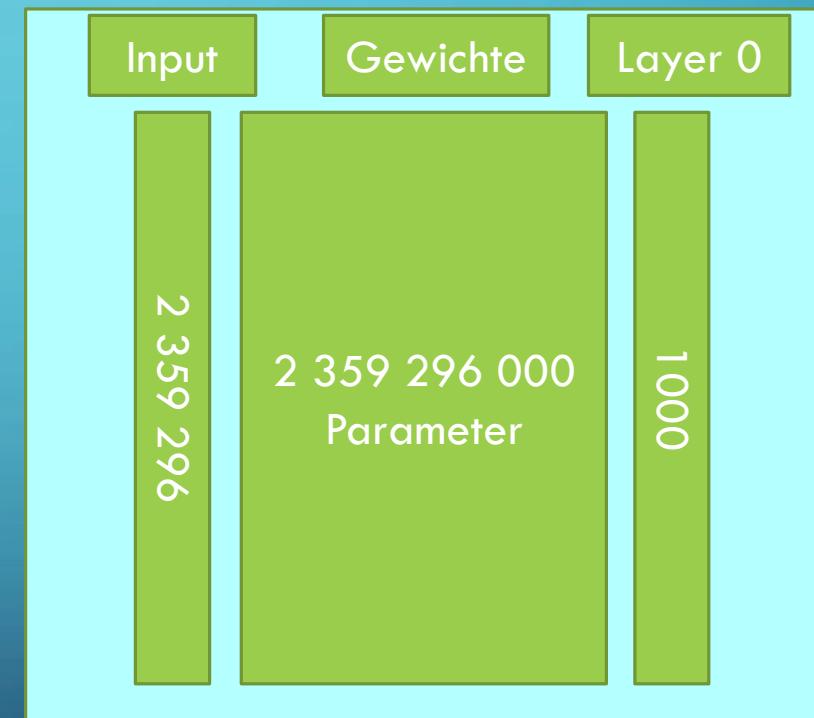


Katze ($x=0.25, y=0.1$)

CHALLENGES

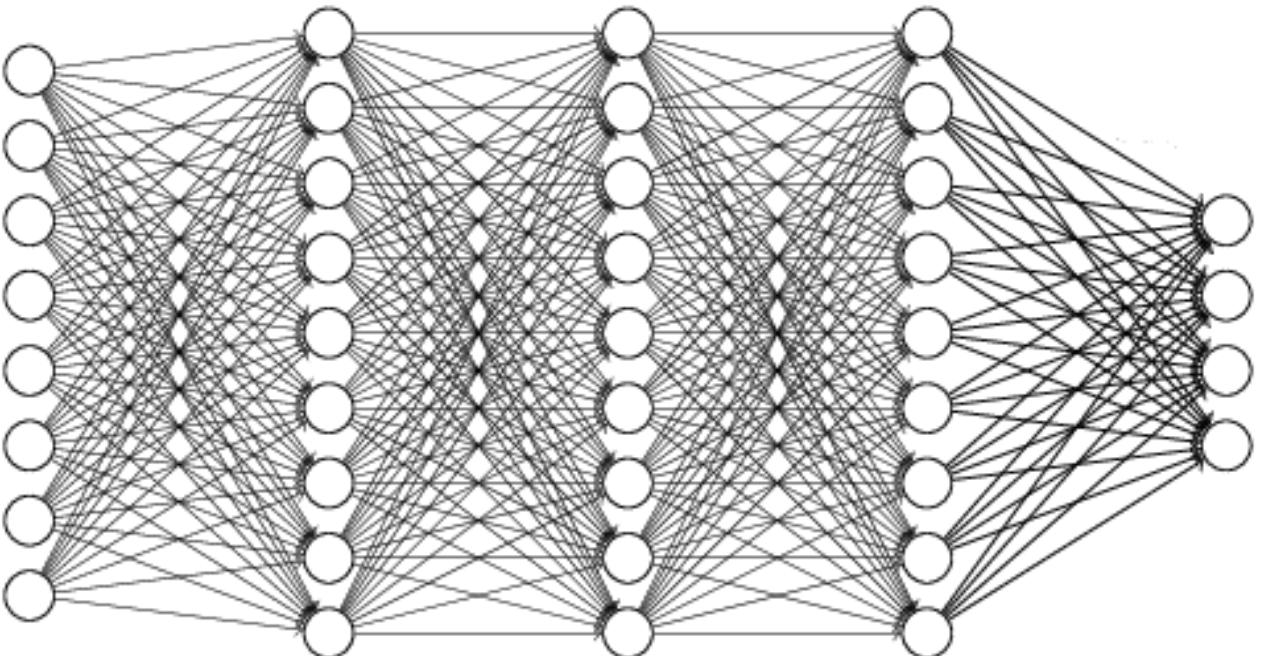


- $1024 \times 768 \times 3 = 2\ 359\ 296$



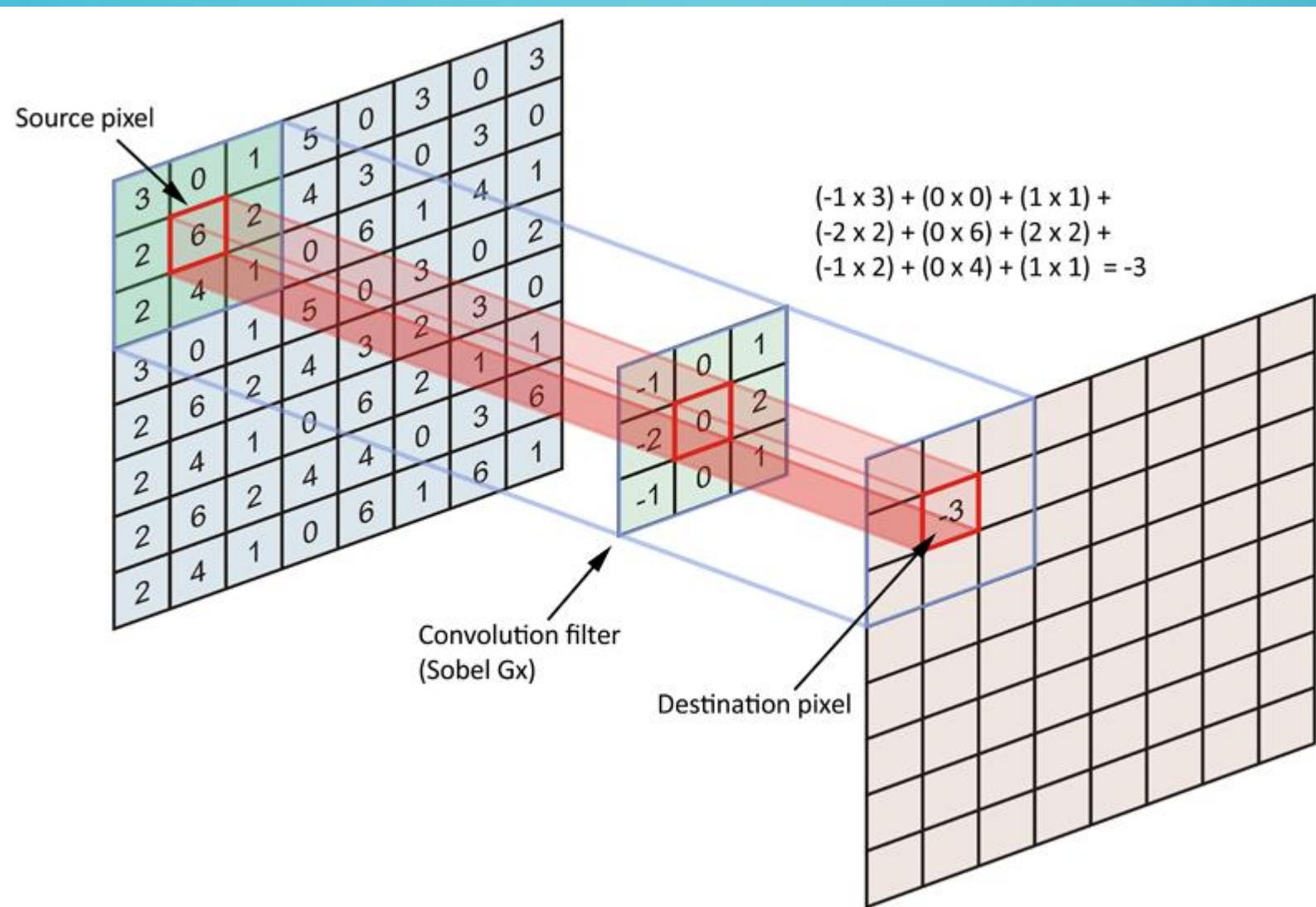
FULLY CONNECTED

- Speicher
- Overfitting

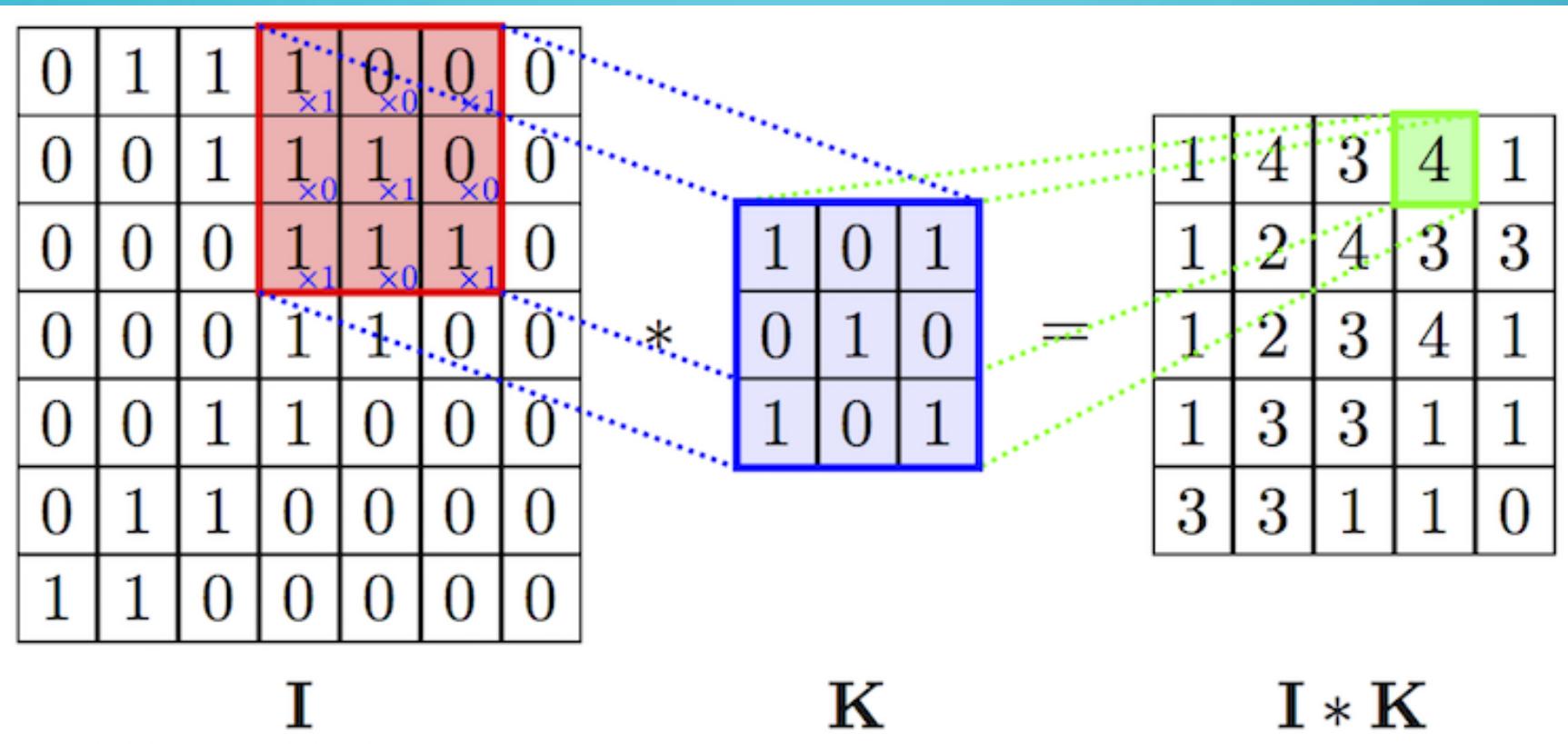


[HTTPS://MATH.STACKEXCHANGE.COM/QUESTIONS/2048722/A-NAME-FOR-LAYERED-DIRECTED-GRAFH-AS-IN-A-FULLY-CONNECTED-NEURAL-NETWORK](https://math.stackexchange.com/questions/2048722/a-name-for-layered-directed-graph-as-in-a-fully-connected-neural-network)

CONVOLUTION - FALTUNG



CONVOLUTION - FALTUNG

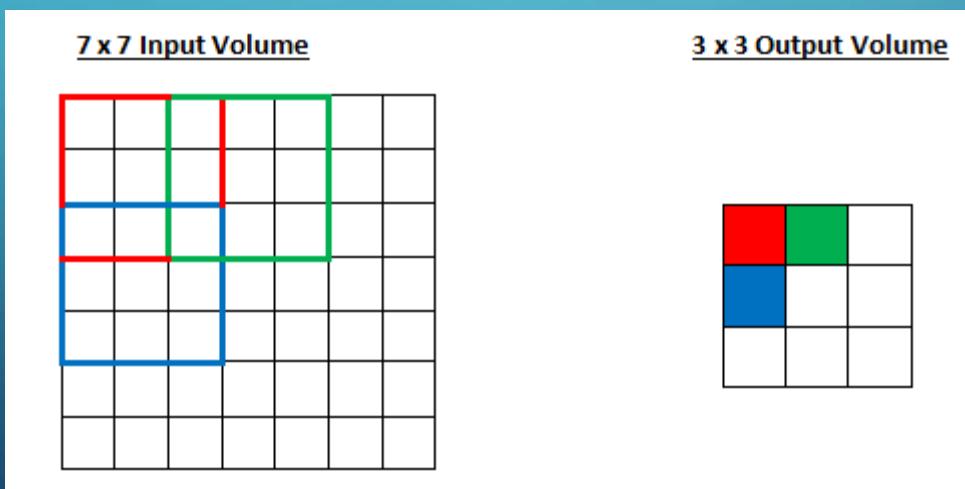
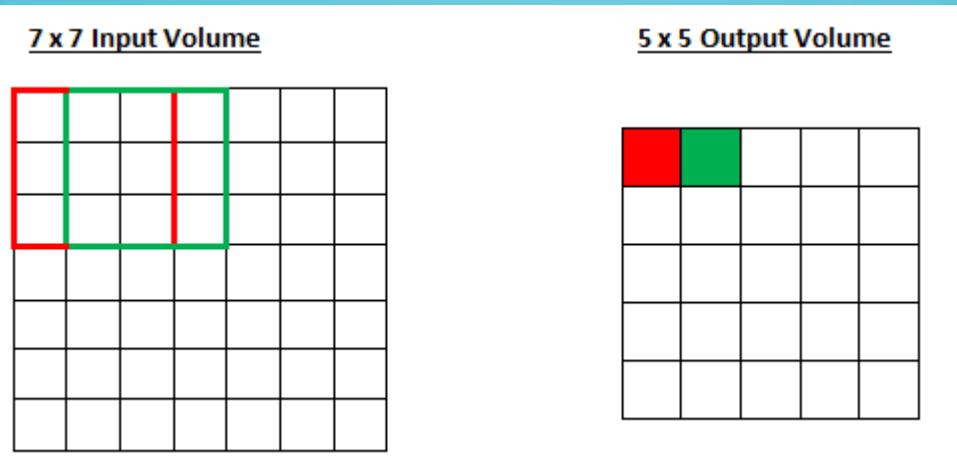


CONVOLUTION - RESULT



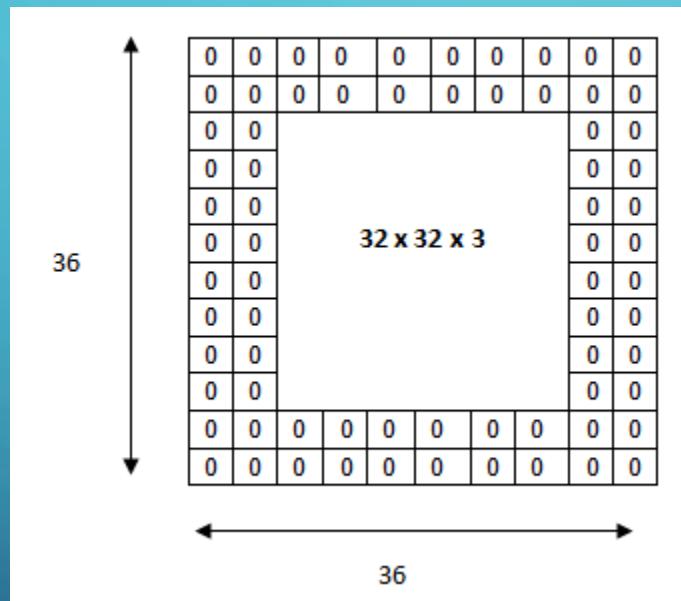
[HTTPS://CAMBRIDGESPARK.COM/CONTENT/TUTORIALS/CONVOLUTIONAL-NEURAL-NETWORKS-WITH-KERAS/INDEX.HTML](https://CAMBRIDGESPARK.COM/CONTENT/TUTORIALS/CONVOLUTIONAL-NEURAL-NETWORKS-WITH-KERAS/INDEX.HTML)

STRIDE



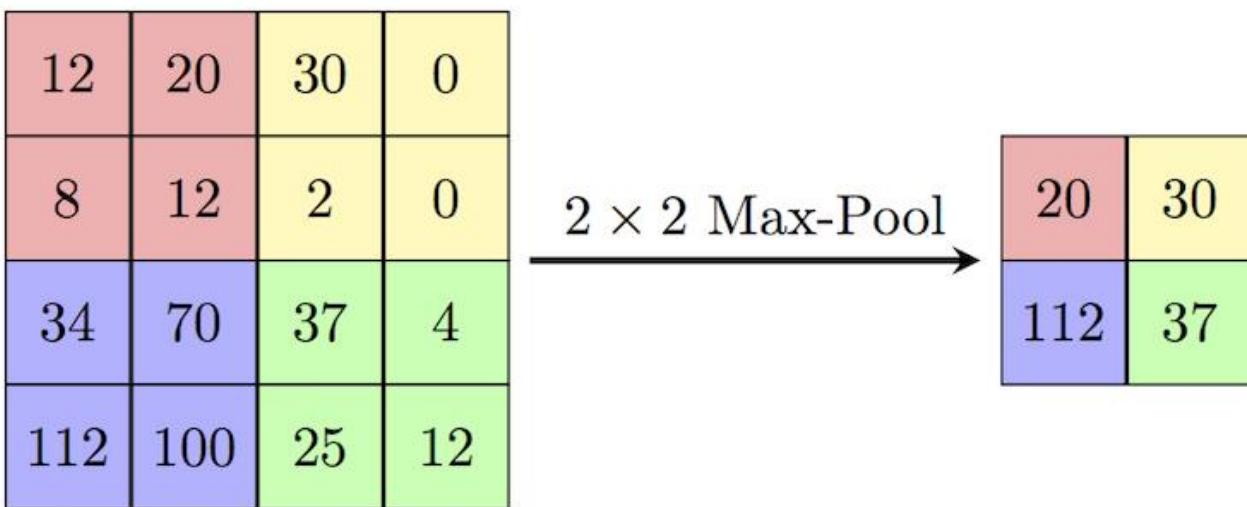
PADDING

- valid
- zero



30

DOWNSAMPLING - POOLING



- Unterstichproben
- Rechenlast vermindern
- weniger anfällig für Verschiebungen
- hat keine Gewichte

BEISPIEL

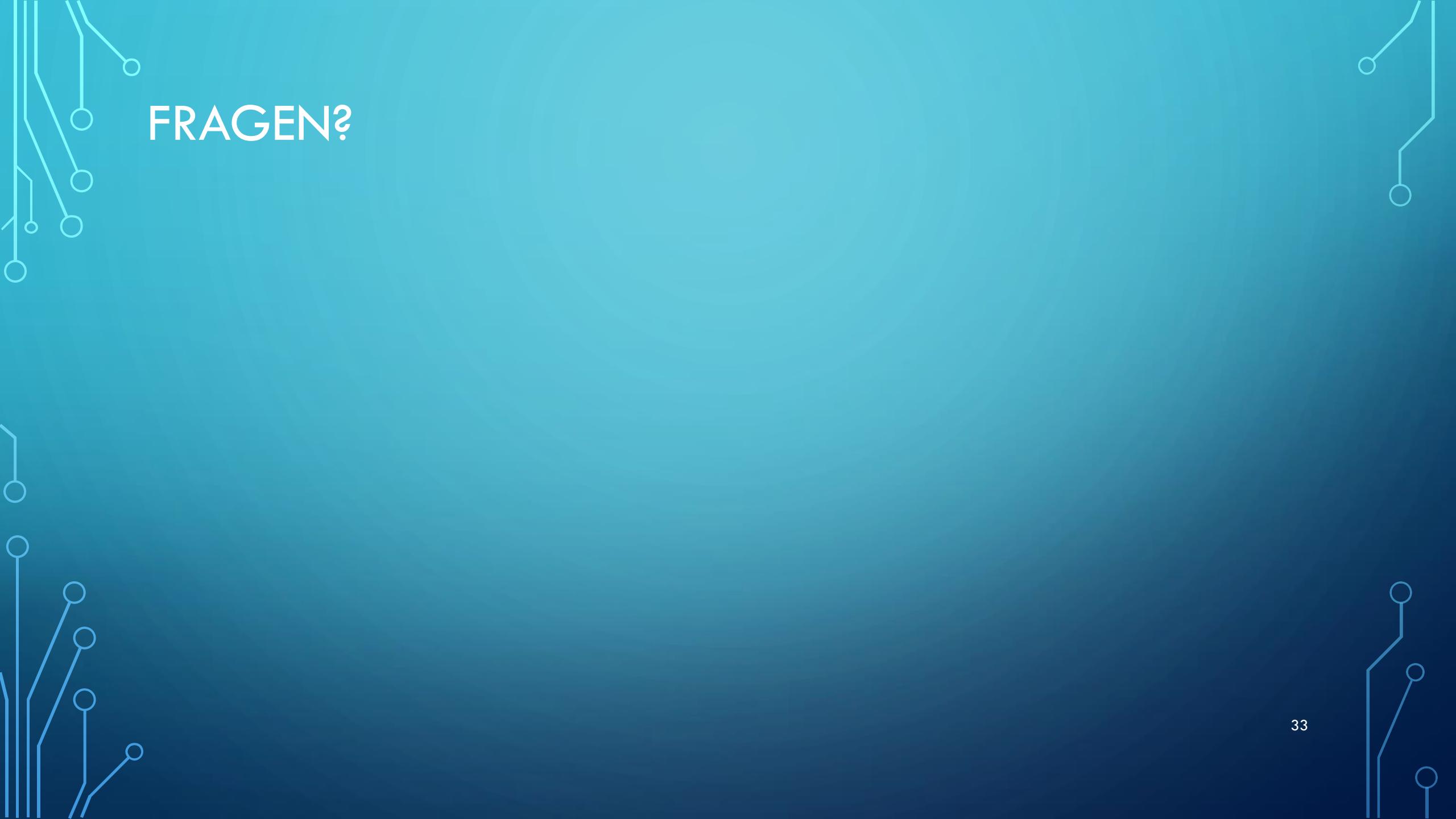
```
conv_1 = Convolution2D(conv_depth_1, (kernel_size, kernel_size), padding='same', activation='relu')(inp)
conv_2 = Convolution2D(conv_depth_1, (kernel_size, kernel_size), padding='same', activation='relu')(conv_1)
pool_1 = MaxPooling2D(pool_size=(pool_size, pool_size))(conv_2)
drop_1 = Dropout(drop_prob_1)(pool_1)

# Conv [64] -> Conv [64] -> Pool (with dropout on the pooling layer)
conv_3 = Convolution2D(conv_depth_2, (kernel_size, kernel_size), padding='same', activation='relu')(drop_1)
conv_4 = Convolution2D(conv_depth_2, (kernel_size, kernel_size), padding='same', activation='relu')(conv_3)
pool_2 = MaxPooling2D(pool_size=(pool_size, pool_size))(conv_4)
drop_2 = Dropout(drop_prob_1)(pool_2)

# Now flatten to 1D, apply FC -> ReLU (with dropout) -> softmax

flat = Flatten()(drop_2)
hidden = Dense(hidden_size, activation='relu')(flat)
drop_3 = Dropout(drop_prob_2)(hidden)
out = Dense(num_classes, activation='softmax')(drop_3)
```

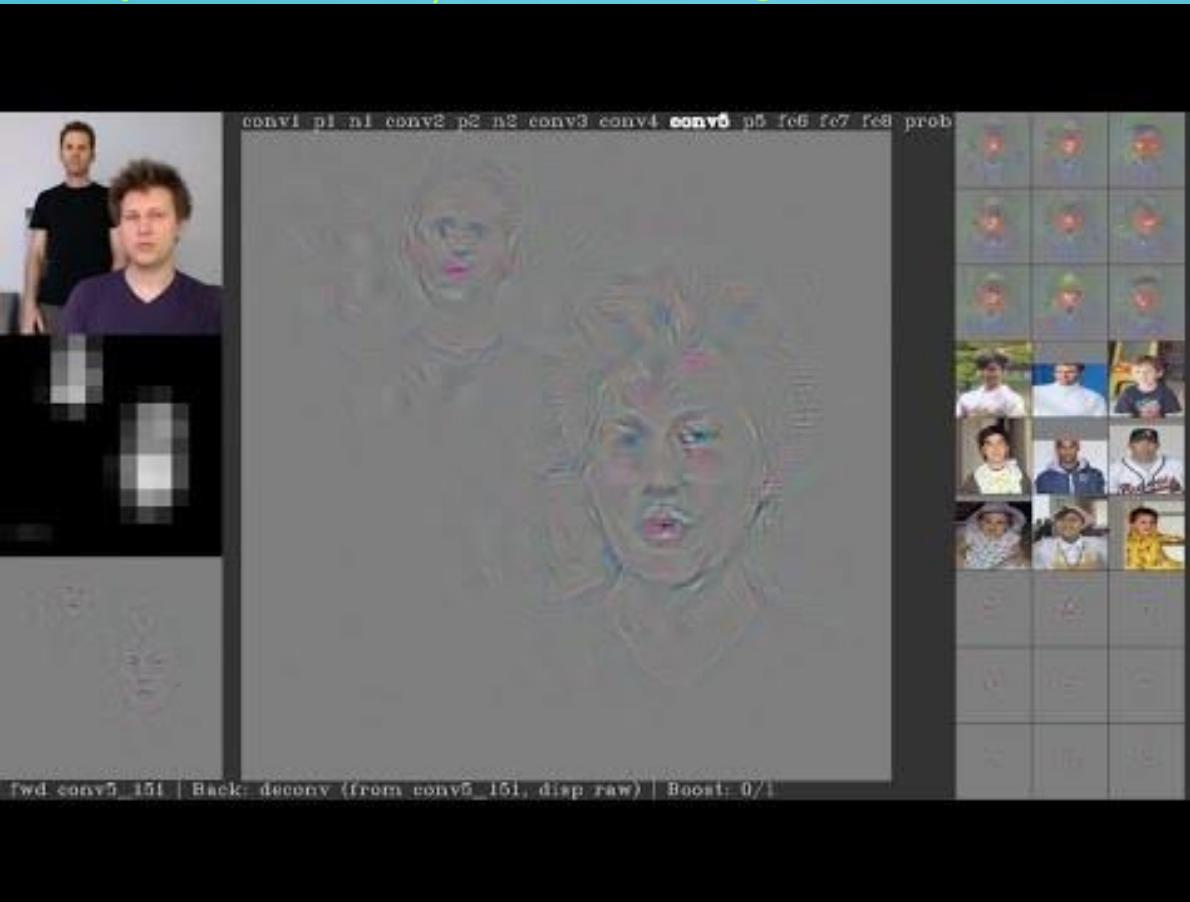
[HTTPS://CAMBRIDGESPARK.COM/CONTENT/TUTORIALS/CONVOLUTIONAL-NEURAL-NETWORKS-WITH-KERAS/INDEX.HTML](https://CAMBRIDGESPARK.COM/CONTENT/TUTORIALS/CONVOLUTIONAL-NEURAL-NETWORKS-WITH-KERAS/INDEX.HTML)



FRAGEN?

INSIDE A NEURAL NET

- <https://www.youtube.com/watch?v=AgkfIQ4lGaM>



OBJECT DETECTION

Ziel:

- unterschiedliche Objekte in einem Bild klassifizieren
- eine Bounding box finden ($x, y, \text{breite}, \text{höhe}$)

supervised learning

FACE RECOGNITION

Input: Bild

Output: Die ID, wenn es sich um ein
Gesicht handelt, das in der Datenbank
ist

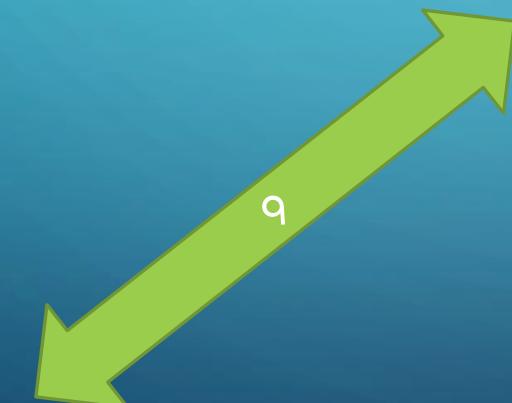
ONE SHOT LEARNING



ONE SHOT LEARNING

- CNN Klassifikation
- $d(\text{img1}, \text{img2}) = \text{Grad des Unterschiedes von zwei Bildern}$
 - wenn $d(\text{img1}, \text{img2}) \leq t \rightarrow$ dieselbe Person
 - wenn $d(\text{img1}, \text{img2}) > t \rightarrow$ unterschiedliche Personen

DIFFERENCE FUNCTION LEARNING

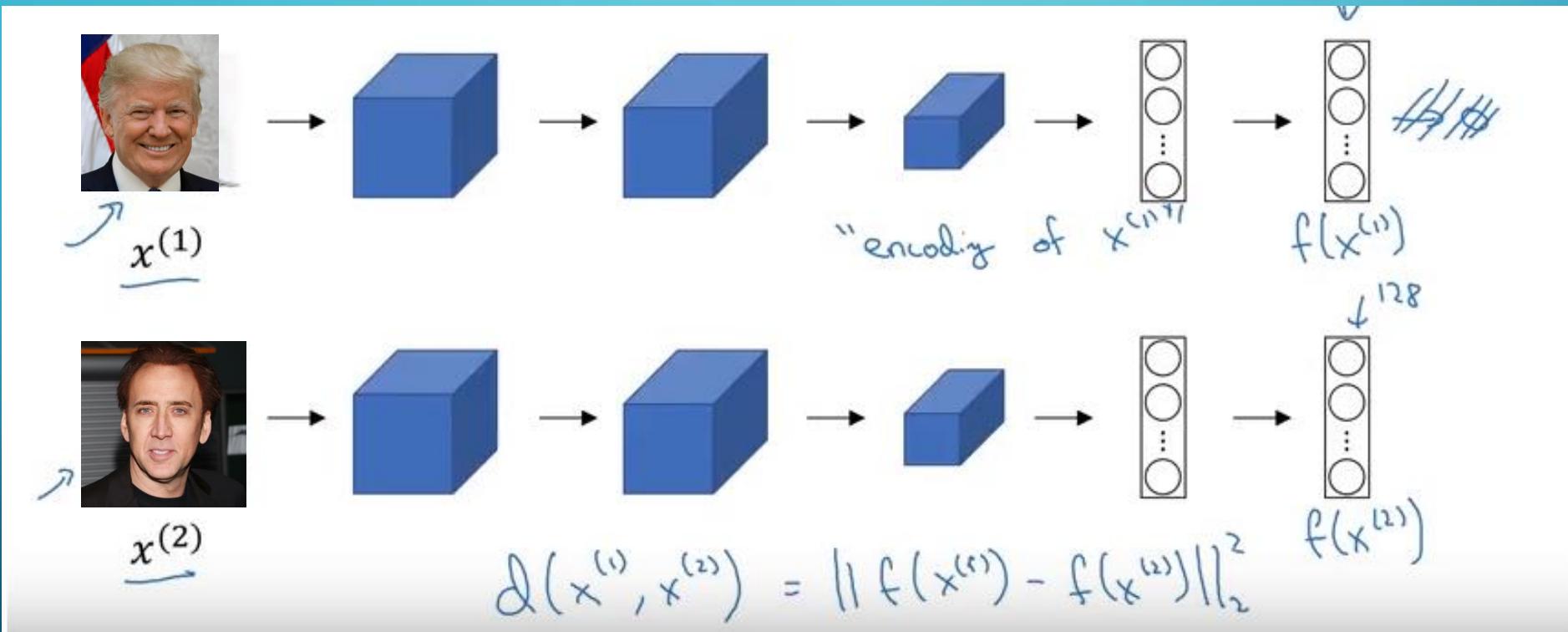


SIAMESISCHES NETZWERK

- CNN wird auf Klassifikationstask trainiert
- Outputlayer (Softmax) wird entfernt
- Netz wird zweimal instanziert
- jedes Netz erhält ein unterschiedliches Bild
- für jedes Bild wird ein Encoding (=Vektor) erstellt
- Die Vektoren werden verglichen $d(\text{img1}, \text{img2})$

HTTPS://WWW.CS.TORONTO.EDU/~RANZATO/PUBLICATIONS/TAIGMAN_CVPR14.PDF

SIAMESISCHES NETZWERK



TRIPLET LOSS

- um die Encodings eines siamesischen Netzwerks unterschiedlicher Personen unterschiedlich zu machen, verwendet man eine Triplet Loss Funktion



Anchor



Positive



Anchor



Negative

$$\mathcal{L} = \max(d(a, p) - d(a, n) + margin, 0)$$

ZUM SELBER MACHEN

- <https://medium.freecodecamp.org/making-your-own-face-recognition-system-29a8e728107c>
- <https://www.coursera.org/learn/convolutional-neural-networks>

The screenshot shows a course page from Coursera. At the top, there's a navigation bar with 'Home', 'Data Science', and 'Machine Learning'. The main title is 'Convolutional Neural Networks'. Below the title, there's a brief description: 'About this course: This course will teach you how to build convolutional neural networks and apply it to image data. Thanks to deep learning, computer vision is working far better than just two years ago, and is enabling numerous exciting applications ranging from safe autonomous driving, to accurate face recognition, to automatic reading of radiology images.' A 'More' link is visible. Further down, there's information about the target audience: 'Who is this class for: - Learners that took the first two courses of the specialization. The third course is recommended. - Anyone that already has a solid understanding of densely connected neural networks and wants to learn convolutional neural networks or work with image data.' At the bottom, it says 'Created by: deeplearning.ai'.

QUESTIONS?



@hdnznger

email:

herbert.danzinger@graz.ai

Deep Learning Graz / Graz.ai

RECEPTIVE FIELDS OF SINGLE NEURONES IN THE CAT'S STRIATE CORTEX

By D. H. HUBEL* AND T. N. WIESEL*

*The Wilmer Institute, The Johns Hopkins Hospital and
University, Baltimore, Maryland, U.S.A.*

(Received 22 April 1959)



KATZENEXPERIMENTE

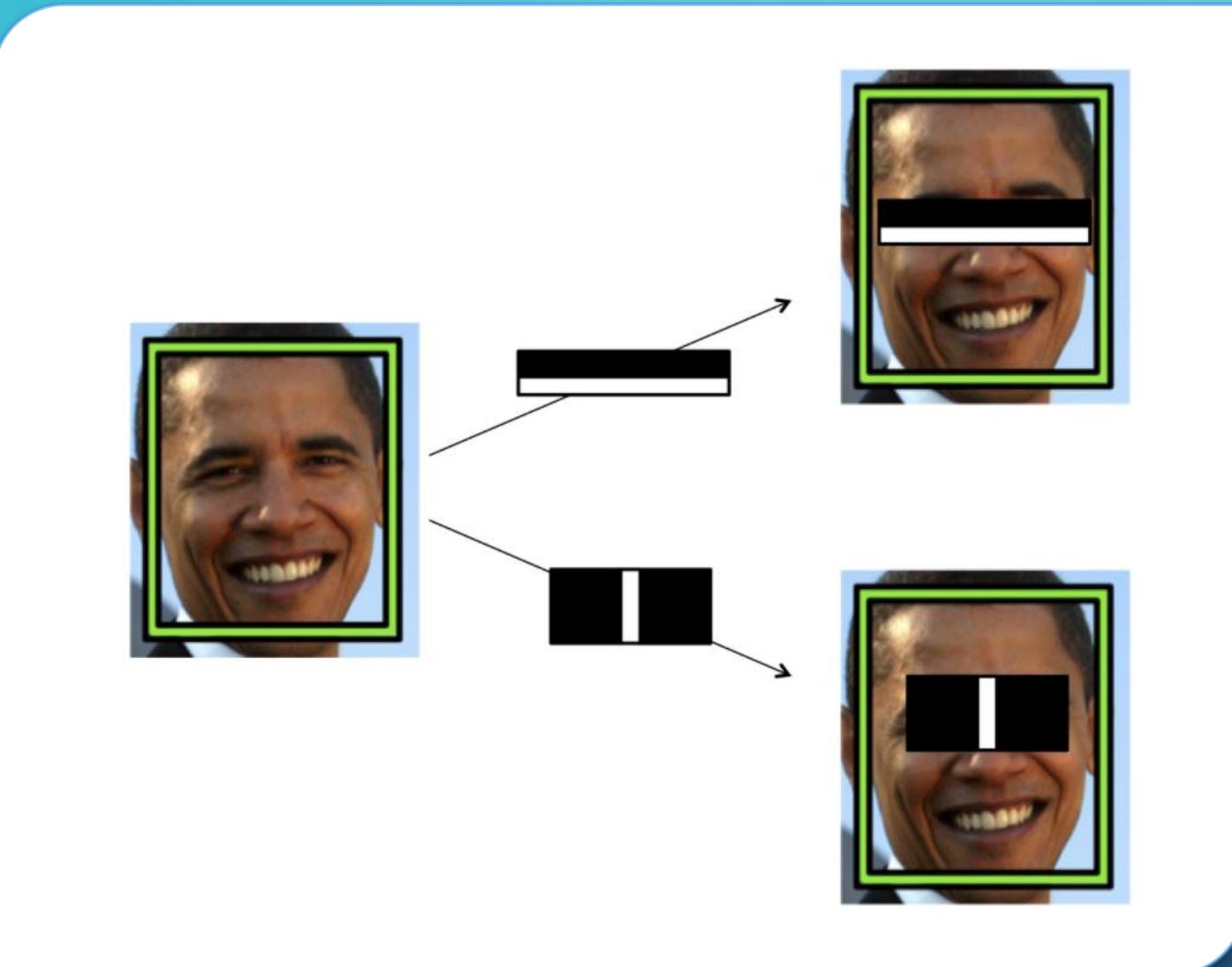
- manche Neuronen im visuellen Cortex reagieren auf einfache Muster
- ander wiederum auf komplexe Muster
- Abstraktionsebene/Schichtenmodell

[HTTPS://WWW.NCBI.NLM.NIH.GOV/PMC/ARTICLES/PMC1363130/PDF/JPHYSIOL01298-0128.PDF](https://www.ncbi.nlm.nih.gov/pmc/articles/PMC1363130/pdf/jphysiol01298-0128.pdf)

45

[HTTPS://WWW.YOUTUBE.COM/WATCH?V=CW5PKV9RJ3O](https://www.youtube.com/watch?v=CW5PKV9RJ3O)

CascadeClassifier::detectMultiScale()



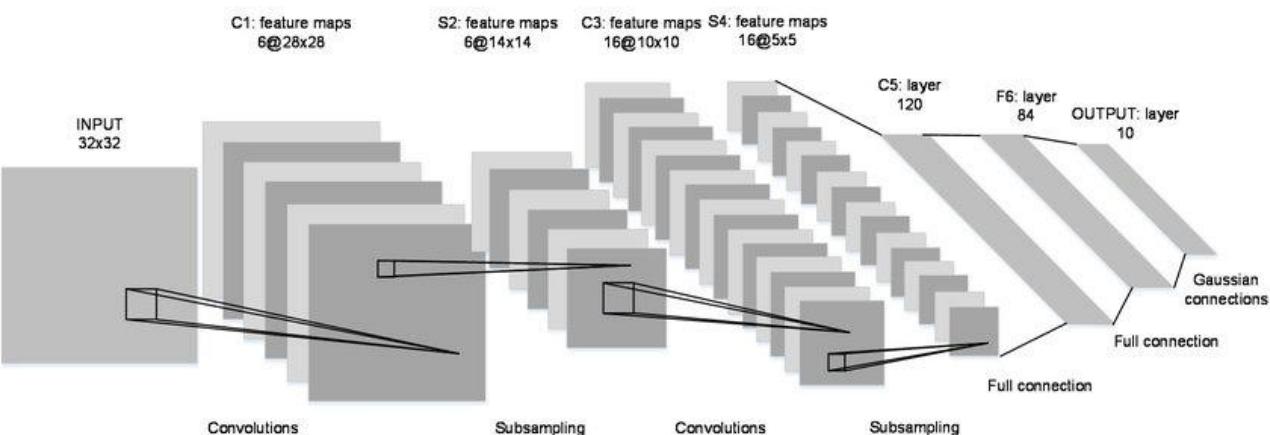
PAUL VIOLA & MICHAEL JONES

- ist auf diesem Bild ein menschliches Gesicht?
- 91,4% detection rate
- 50 false positives
- 130 Bilder, 507 Gesichter
- Nachteile:
 - Licht
 - verknittertes Foto
 - teils verdecktes Gesicht

[HTTPS://DE.WIKIPEDIA.ORG/WIKI/VIOLA-JONES-METHODE](https://de.wikipedia.org/wiki/Viola-Jones-Methode)

LENET 5

- Yann Lecun, Leon Bottou, Yoshua Bengio, Patrick Haffner
- Erkennung handgeschriebener Ziffern auf Schecks
- Convolutional layers
- Pooling Layers
- Fully connected



[HTTPS://WWW.RESEARCHGATE.NET/FIGURE/THE-LENET-5-ARCHITECTURE-A-CONVOLUTIONAL-NEURAL-NETWORK FIG4_321586653](https://www.researchgate.net/figure/THE-LENET-5-ARCHITECTURE-A-CONVOLUTIONAL-NEURAL-NETWORK FIG4_321586653)