

Mitobunny -A game to annotate Mitotic Cells

Srijeet Chatterjee, Mingxuan Gu, Zhaoya Pan, Wenyu Zhang, Muhammed Umer Raja 22nd July, 2019

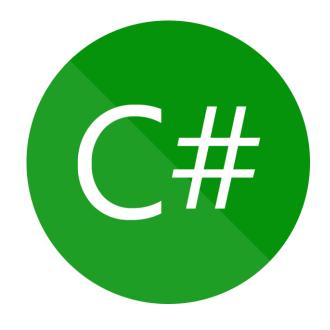


Lecturers

Prof. Dr.-Ing. habil. Andreas Maier, Dr. rer. biol. hum. Ludwig Ritschl, Prof. Dr.-Ing. Joachim Hornegger



Platform





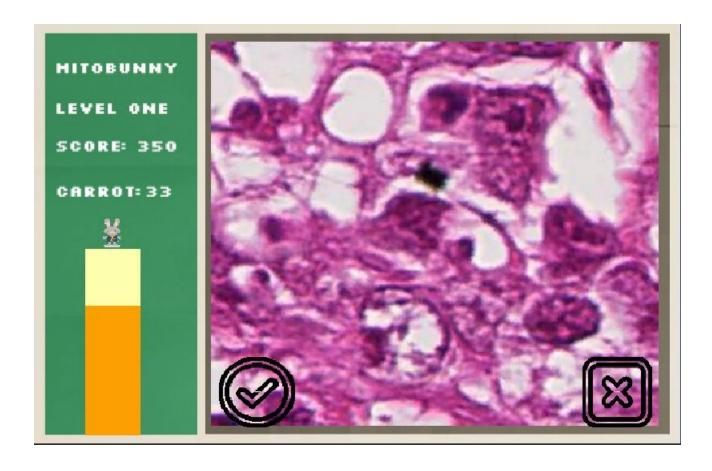


Mitobunny





Mitobunny

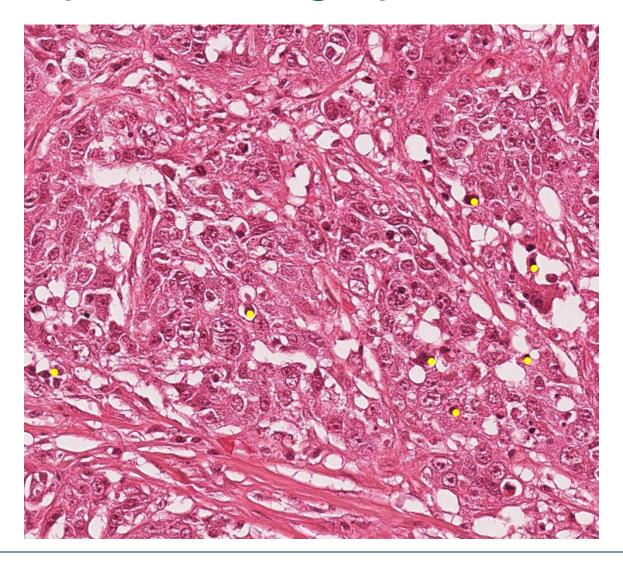






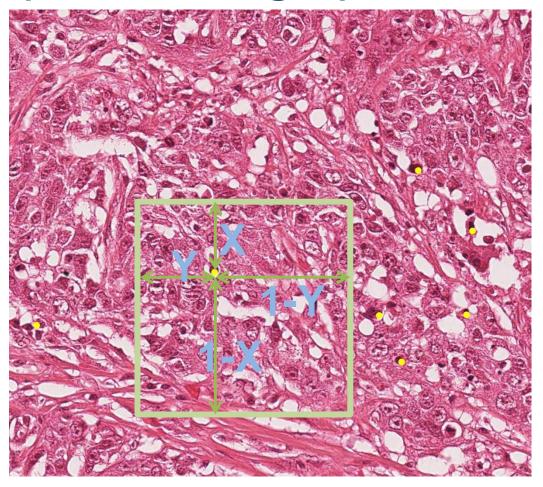


Database(mitosis images)





Database(mitosis images)



X, Y = Random(0, 1)

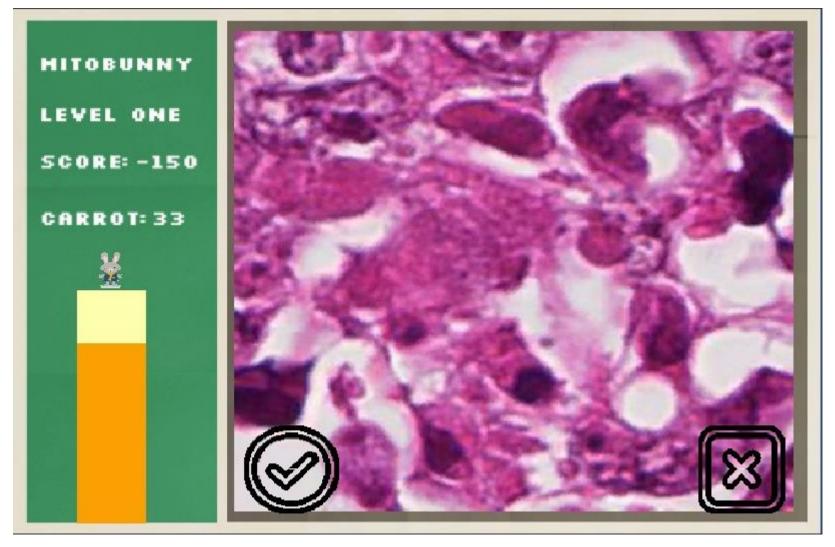


Database(user information)

	age	city	country	Email	familyname	firstname	institute	level	score	sex	password	carrots
•	22	SiChuan	China	aaaaaaa@qq.com	qqqqq	dfdfdfdf	abc	0	1200	male	trans III	33
	40	cmKnL	Germany	ACrFQ.kgOeTMQlD@fau.de	NBVjW	eDRRovmz	Ger-A	0	18	female		0
	40	gfphdam	Germany	AdlChFgT.R@163.com	Ey	JYTfJb	Ger-A	0	42	female		0
	15	tiCqGn	Germany	AHcR.cmf@icloud.com	AOtmog	ctHbWPcJO	Ger-A	0	83	female		0
	65	aGFqoNC	Germany	awWXUAYI.ecPzIimb@fau.de	TvrD	FRiahg	Ger-A	0	54	male		0
	32	FDLcI	Germany	Bb.U@163.com	TBemt	iCjIkdKYJ	Ger-A	0	73	female		0
	23	cVtKHKM	Germany	Bc.jR@fau.de	xpPxN	uTbREcx	Ger-B	0	31	male		0
	24	ECVzfPzEd	Germany	BcMkat.yNRd@fau.de	myw	rXxJow	Ger-B	0	65	female		0
	74	gCtAvG	Germany	BDjpgbrl.zCQctFmc@qq.com	jSB	yaAMOFDIJdN	Ger-B	0	85	female		0
	30	olDxW	Germany	BEvKIM.SuNYUsn@163.com	Rf	EjQPpjb	Ger-B	0	77	male		0
	68	DMbeHbC	Germany	bvAflH.idqiQq@163.com	EtWWmQ	IVhTfigyE	Ger-B	0	55	male		0



Scoring(L1):





Scoring(L1):

MITOBUNNY LEVEL ONE SCORE: CARROT: 5 RESTORE HP.



Scoring(L1):



Carrot: math.floor(max(score, 0)/100)



Leader Board:





So let's recall our Objective:

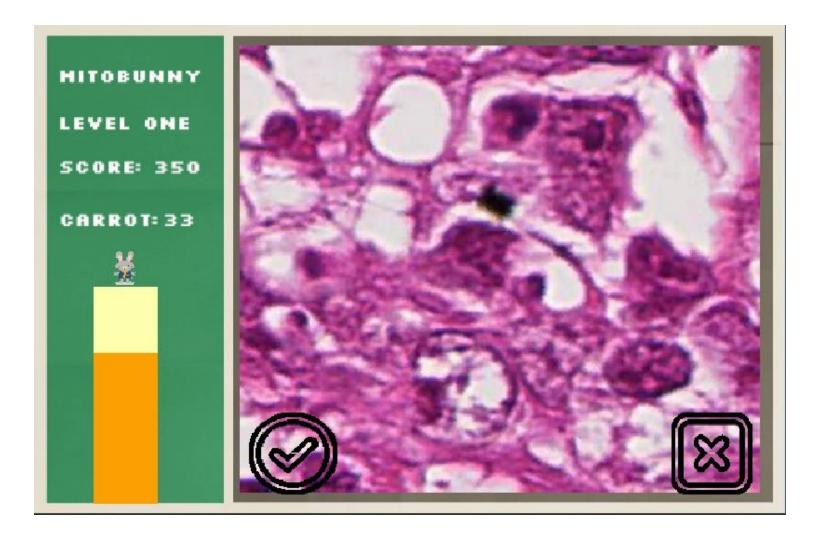
Deep Learning-based algorithms showed great performance in many fields of image procession and pattern recognition and compete with technologies such as compressive sensing and iterative optimization. The basis for the success of these algorithms is the availability of large amounts of data (big data) for training and of high computing power (typically GPUs).

A major shortcoming is typically the number of labels that is required to train machine learning algorithms. Therefore, this project seminar will look into how to tackle this problem looking into topics of crowd-sourcing and gamification.

To arrive at good solutions also mobile game development will be a topic of interest. Aim of the seminar is to develop a prototype level for such a gamification-based crowd sourcing approach.

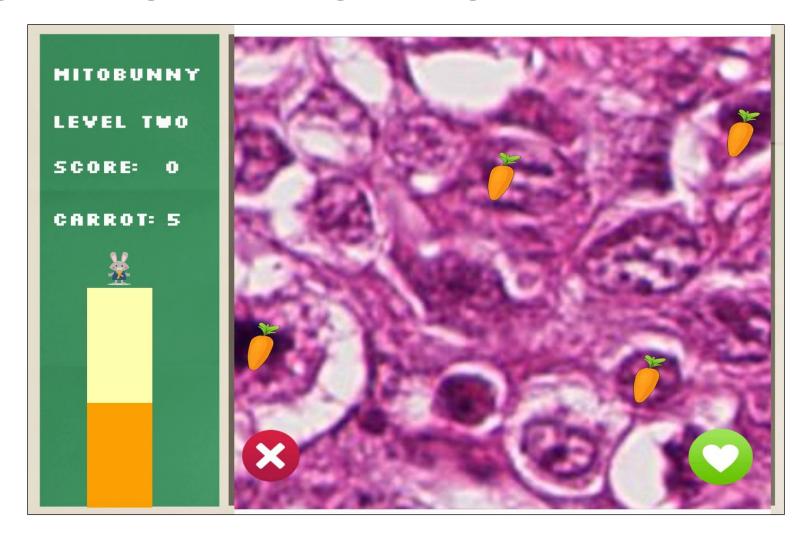


RECOGNITION PHASE: LEVEL-1





UNDERSTANDING PHASE: LEVEL-2





WHAT'S NEXT???



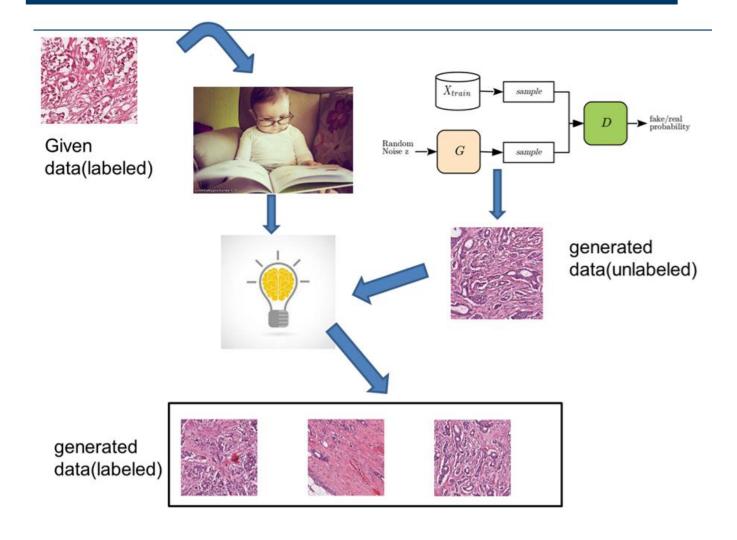
WHAT'S NEXT???

REAL GAME!!!!

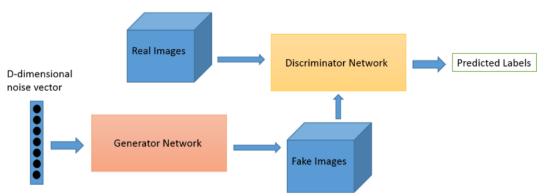
LEVEL-3



Data Generation and Annotation



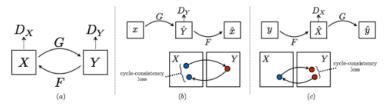
Cycle GAN



- . The Generator model conditions on some inputs and learns to generate an image.
- The Discriminator model scores how 'real' images look, learning to distinguish between generated and real images. This score provides feedback to
 the generator on how well it is performing, like a teacher grading a student.
- . Both models are trained simultaneously, and the feedback loop between the two improves the performance of each other.
- · Post-training, the Generator should be able to produce original, realistic looking images.

CycleGAN: Cycle Consistency

To learn to translate images of one type to another, CycleGAN uses an intuition called cycle consistency, using two generators and two discriminators. Given image domains X and Y, we have:

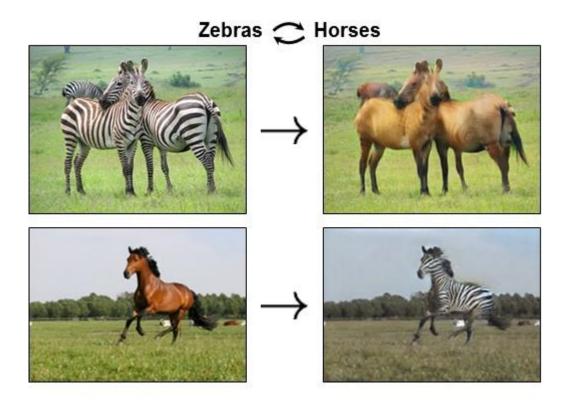


- ullet Generator G:X o Y: translates images from X to Y (e.g. horse to zebra)
- Generator $F:Y \to X$: translates images from Y to X (e.g. zebra to horse)
- Discriminator D_X : scores how real an image of X looks (e.g. does this image look like a horse?)
- Discriminator D_Y: scores how real an image of Y looks (e.g. does this image look like a zebra?)

The intuition of cycle consistency is that, if you are able to train these pair of GANs to translate from $X \to Y \to X$, i.e. generate images while assuring cycle consistency, that $x \to G(x) \to F(G(x)) \approx x$, then you would have learned the image translation task sufficiently well.



Expectation

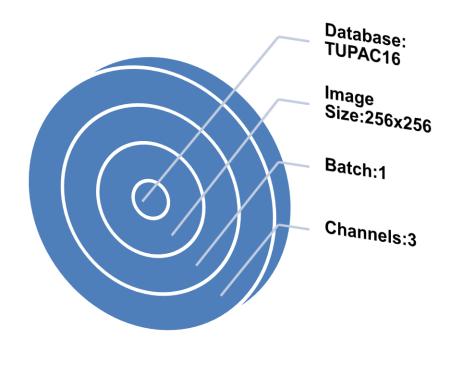


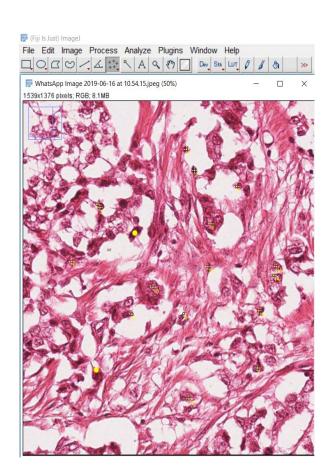


Reality











Res-net Discriminator Patch-Discriminator

Padding

Conv2d→Relu

Padding

Conv2d→Relu

Conv2d→Relu
Conv2d→Relu
Conv2d→Relu
Conv2d

Crop

Conv2d→Relu

Conv2d→Relu

Conv2d→Relu

Conv2d

Generator

Padding

Conv2d→Relu

Conv2d→Relu

Res-net Layer

Res-net Layer

Res-net Layer

Res-net Layer

Res-net Layer

Res-net Layer

Decon→Relu

Deconv→Relu

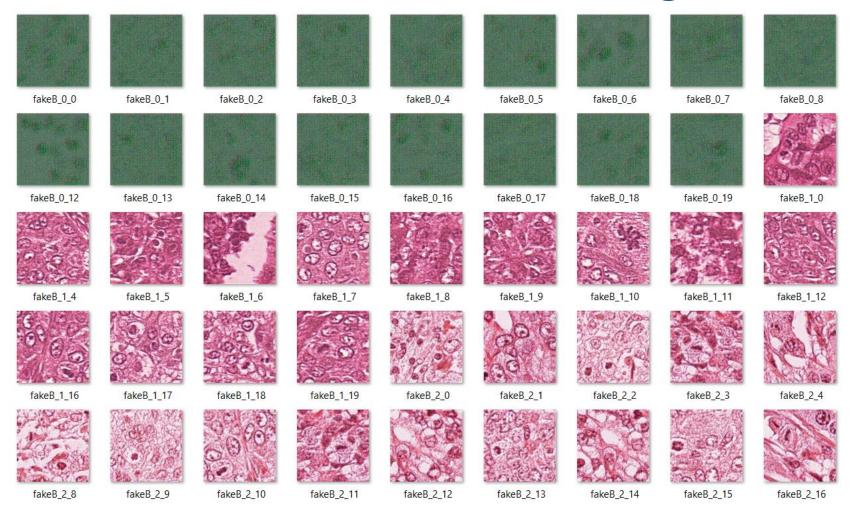
Conv2d→tanH

```
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File Edit Search Source Run Debug Consoles Projects Tools View Help
 5 1
Editor - F:\FAU STUDY MATERIAL\CycleGAN_TensorFlow\model.py
                                                                                                                                                           Source Console 
Object
temp.py 🖸 epipolarConsistencyExercise.py 🖸 model.py 🖸
  24 def get_outputs(inputs, network="tensorflow", skip=False):
         images a = inputs['images a'
                                                                                                                                                                           Here you can get help of
        images_b = inputs['images_b']
                                                                                                                                                                           any object by pressing
                                                                                                                                                                           Ctrl+I in front of it, either on
         fake_pool_a = inputs['fake_pool_a']
                                                                                                                                                                           the Editor or the Console
         fake_pool_b = inputs['fake_pool_b']
        with tf.variable scope("Model") as scope:
                                                                                                                                                                           automatically after writing a
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            if network == "pytorch":
                                                                                                                                                                           object. You can activate
                current_discriminator = discriminator
                                                                                                                                                                           this behavior in
                current_generator = build_generator_resnet_9blocks
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                current discriminator = discriminator tf
                                                                                                                                                               Variable explorer File explorer Help
                current_generator = build_generator_resnet_9blocks_tf
                                                                                                                                                              IPython console
                                                                                                                                                              Console 1/A 🛛
                     'network must be either pytorch or tensorflow
                                                                                                                                                             Python 3.7.3 (default, Mar 27 2019, 17:13:21)
                                                                                                                                                              [MSC v.1915 64 bit (AMD64)]
                                                                                                                                                              Type "copyright", "credits" or "license" for
             prob_real_a_is_real = current_discriminator(images_a, "d_A")
                                                                                                                                                              more information.
            prob real b is real = current discriminator(images b, "d B")
                                                                                                                                                              IPython 7.4.0 -- An enhanced Interactive Python.
             fake_images_b = current_generator(images_a, name="g_A", skip=skip)
             fake_images_a = current_generator(images_b, name="g_B", skip=skip)
                                                                                                                                                              In [1]:
            prob fake_a_is_real = current_discriminator(fake_images_a, "d_A")
            prob_fake_b_is_real = current_discriminator(fake_images_b, "d_B")
             cycle_images_a = current_generator(fake_images_b, "g_B", skip=skip)
            cycle_images_b = current_generator(fake_images_a, "g_A", skip=skip)
            prob_fake_pool_a_is_real = current_discriminator(fake_pool_a, "d_A")
             prob_fake_pool_b_is_real = current_discriminator(fake_pool_b, "d_B")
             'prob_real_a_is_real': prob_real_a_is_real,
                                                                                                                                  Permissions: RW End-of-lines: LF Encoding: ASCII
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https://github.com/leehomyc/cyclegan-1

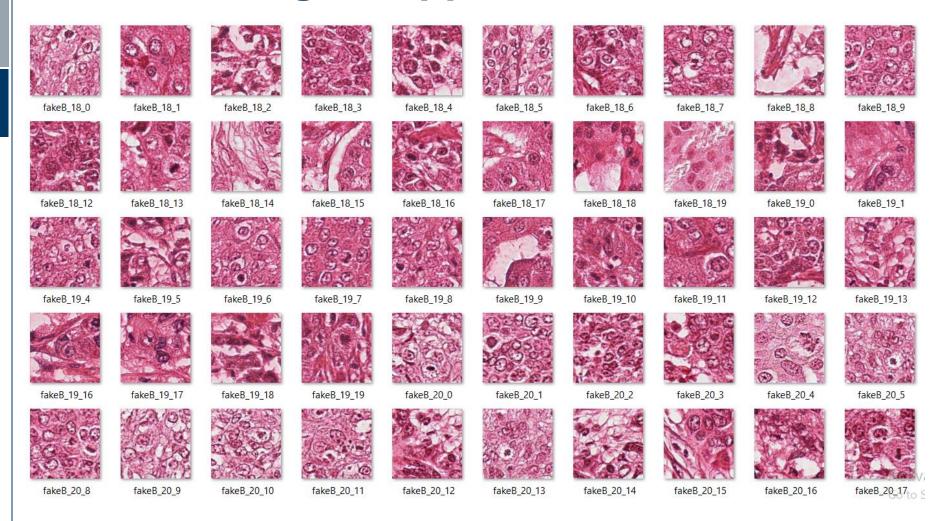


Our Trial for Artificial Mitotic Images



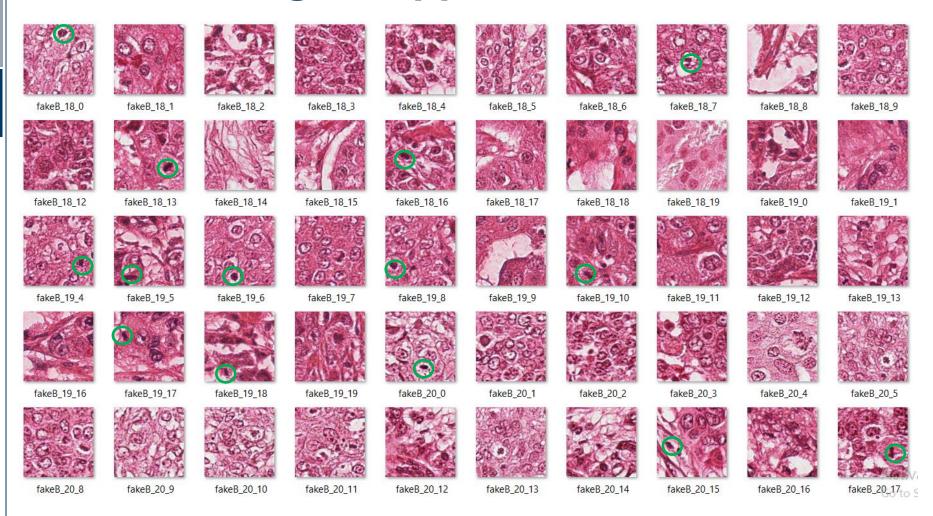


Does the Magic Happen?





Does the Magic Happen?





Experts Feedback in an Interview



Dipl.-Ing. Marc Aubreville

Researcher in the <u>Computer Vision (CV)</u> group at the <u>Pattern Recognition</u> <u>Lab</u> of the Friedrich-Alexander-Universität Erlangen-Nürnberg



Christian Marzahl M. Sc.

Researcher in the Computer Vision (CV) group at the Pattern Recognition Lab of the Friedrich-Alexander-Universität Erlangen-Nürnberg



Why Fake Images for Annotation!!!

Mitotic data is available only for specific tissue types .e.g breast tissue, dog cells.

With fake Images, can we achieve more generalisation , i.e data for organs where mitotic data is not that widely available?

Finally, our game would work both on fake and real data and the approach is not limited to mitosis....



Problems:

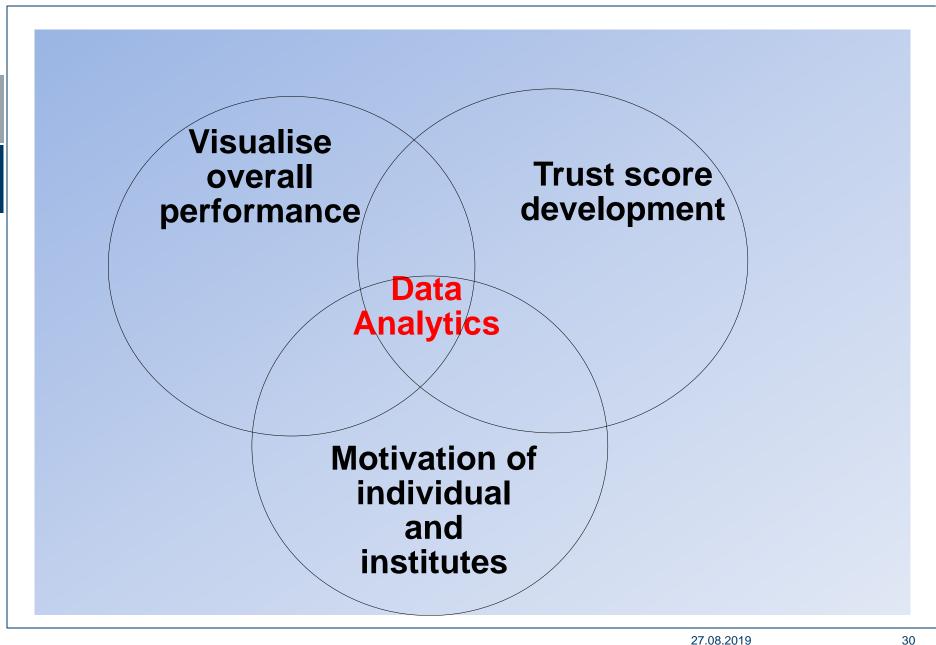
User labels might vary for same images.

How can we trust the labels!!!

Solution:

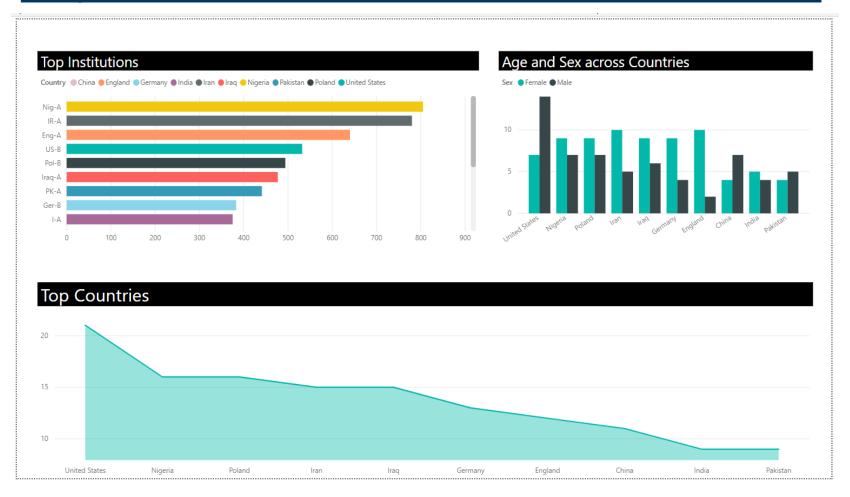
We need a trust score model.







Key Performance Indicators Dashboard





Leader Board- Key Performance Indicators

Analytical Leader Board									
AxhQsw	Nig-A	72	tYbFg.KgSXgLR@fau.de						
FirstName	Institution	Score	Email						
bPhehJSjGSJ	Nig-A	78	uPNvSR.G@163.com						
FirstName	Institution	Score	Email						
bqSsag	Nig-A	27	tvO.nGVp@fau.de						
FirstName	Institution	Score	Email						
FnNjwmg	Nig-A	83	Wa.YnGkUyQh@fau.de						
FirstName	Institution	Score	Email						
IhrmuhYKjgACu	Nig-A	68	tgcWFj.m@gmail.com						
FirstName	Institution	Score	Email						
IVAxEc	Nig-A	75	Tw.v@163.com						
FirstName	Institution	Score	Email						
nkBQBOL	Nig-A	13	U.xXmpQPnl@icloud.com						
FirstName	Institution	Score	Email						
PfWbLTjsGwi	Nig-A	57	VrSYmgzY.QfL@gmail.com						
FirstName	Institution	Score	Email						
qlwqXcpdFGMeK	Nig-A	67	TNJ.lav@fau.de						
FirstName	Institution	Score	Email						
TUYtLB	Nig-A	2	vaoLrt.Ls@gmail.com						
FirstName	Institution	Score	Email						
uezsjjlxDt	Nig-A	84	uEXRPa.ibILcL@icloud.com						
FirstName	Institution	Score	Email						



Accomplishments

- Design of game level system
- Fully-built database
- Tutorial and level 1 of the game
- Part of level 2 game control
- Fake images generated by cycleGAN



- Implementation of level 2 and level 3 game
 - Introduce hint option
 - Scoring and rewards for level 2

of carrots = foundation reward
$$\times (1 + \frac{\text{right clicks}}{\text{total clicks}})$$



- Implementation of level 2 and level 3 game
 - Introduce hint option
 - Scoring and rewards for level 2
 - League mechanism for level 3

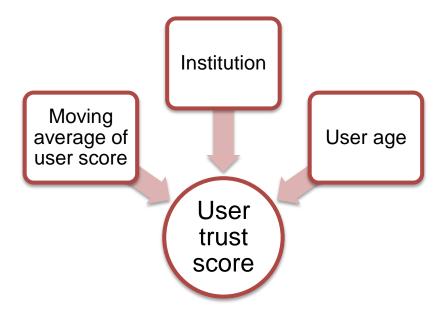
Players get certain number of unannotated data during the season

Players get stable rewards after completing annotation of an image After the season, compute the labeling result by majority voting and user ranking

Users get additional reward based on their ranking



- Crowdsourcing in the backend
 - Compute individual trust score according to user performance





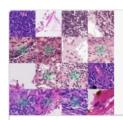
- Crowdsourcing in the backend
 - Compute individual trust score according to user performance
 - Aggregation
 - Maximum weighted crowd votes (ωCV)
 - maximum weighted crowd trust scores (ωCT)

$$\omega CV = \frac{\omega_A V_A + \omega_B V_B + \omega_C V_C + \omega_D V_D}{V_A + V_B + V_C + V_D}$$

$$\omega CT = \frac{\omega_A T_A + \omega_B T_B + \omega_C T_C + \omega_D T_D}{T_A + T_B + T_C + T_D}$$



- Extend to other fields
 - Similar approach for labeling can easily extend to other tasks



PatchCamelyon

PatchCamelyon is a new and challenging image classification dataset of 327.680 color images (96 x 96px) extracted from histopathology images of the CAMELYON16 challenge. The goal is to detect breast cancer metastasis in lymph nodes.



Gleason2019

MICCAI 2019 Automatic Prostate Gleason Grading Challenge: This challenge aims at the automatic Gleason grading of prostate cancer from H&E-stained histopathology images. This task is of critical importance because Gleason score is a strong prognostic ...



curious2019

MICCAI Challenge 2019 for Correction of Brainshift with Intra-Operative Ultrasound. Taks 1: Register pre-operative MRI to iUS before tumor resection; Taks 2: Register iUS after tumor resection to iUS before tumor resection



Contribution Table

Swipeable view(GUI)
Swiping functionality
Click function to locate mitosis

Wenyu Zhang
Scene design
UI design
Registration control
Background music
Trust Score Model

CycleGAN implementation
Database(JSON file to CSV)
UI design

Analytics Dashboard for Trust Score, Motivation

Mingxuan Gu

Database connection

Leaderboard scene(control)

Registration scene(control)

· Image preprocessing

User data storage

Zhaoya Pan

Image preprocessing

Scoring system design

Scoring and rewards implementation

Load images to view