

- HeadTop/neck/bodyCenter
- Left shoulder/elbow/wrist
- Right shoulder/elbow/wrist
- Left hip/knee/ankle
- Right hip/knee/ankle

CSCI 5561 COMPUTER VISION

HYUN SOO PARK

3D Motion Reconstruction
(Trajectory Stream Association)



Projection on A Novel HD View

WHAT THIS IMAGE CAN TELL US ABOUT THE SCENE?



WHAT THIS IMAGE CAN TELL US ABOUT THE SCENE?

- Rainy day
- Street market
- People / role
- Interaction
- Car/fruit/shelter
- Distance
- Height of the cameraman



WHAT THIS IMAGE CAN TELL US ABOUT THE SCENE?

- Rainy day
- Street market
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COMPUTER VISION

Def) computationally understanding the scene/image.

Cf) image processing

WHAT THIS IMAGE CAN TELL US ABOUT THE SCENE?

- Rainy day
- Street market
- People / role
- Interaction
- Car/fruit/shelter
- Distance
- Height of the cameraman

COMPUTER VISION

Def) computationally understanding the scene/image.

Cf) image processing

Extremely difficult

of pixels: 8.2M



Marvin Minsky, MIT

Birth of Computer Vision

In 1966, Minsky hired a first-year undergraduate student and assigned him a problem to solve over the summer:

Connect a camera to a computer and get the machine to describe what it sees.

MASSACHUSETTS INSTITUTE OF TECHNOLOGY
PROJECT MAC

Artificial Intelligence Group
Vision Memo. No. 100.

July 7, 1966

THE SUMMER VISION PROJECT

Seymour Papert

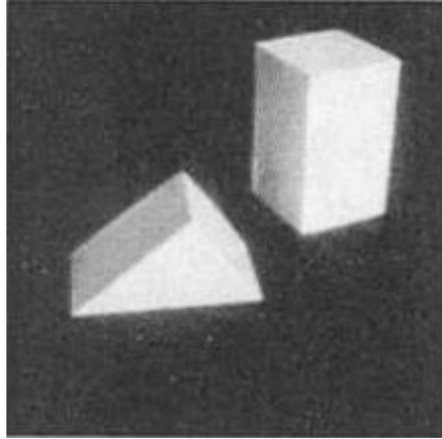
The summer vision project is an attempt to use our summer workers effectively in the construction of a significant part of a visual system. The particular task was chosen partly because it can be segmented into sub-problems which will allow individuals to work independently and yet participate in the construction of a system complex enough to be a real landmark in the development of "pattern recognition".

1960's: interpretation of synthetic worlds

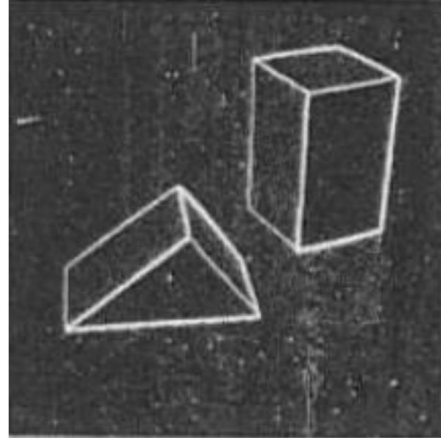


Larry Roberts

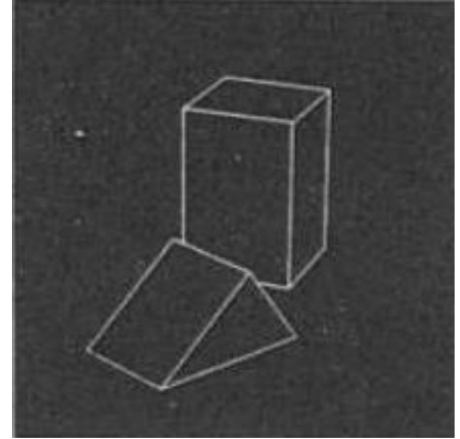
“Father of Computer Vision”



Input image



2x2 gradient operator

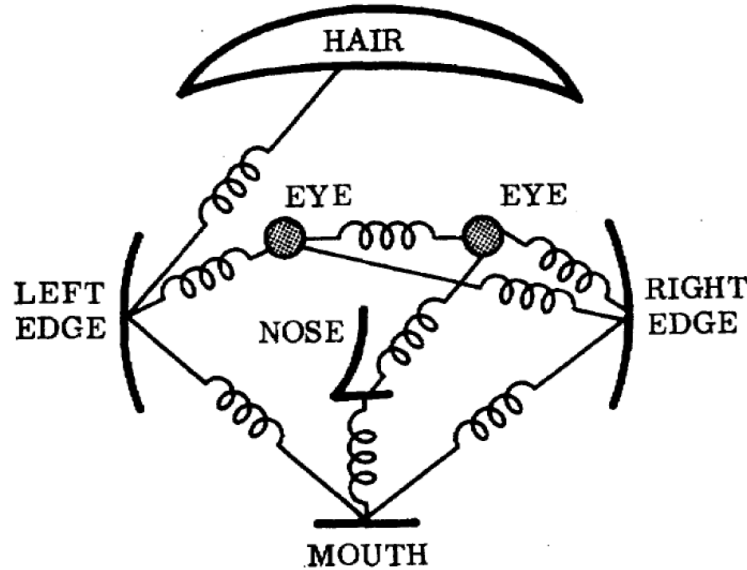


computed 3D model
rendered from new viewpoint

Larry Roberts PhD Thesis, MIT, 1963,
Machine Perception of Three-Dimensional Solids

Slide credit: Steve Seitz

1970's: some progress on interpreting selected images



	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35
	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35
	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35

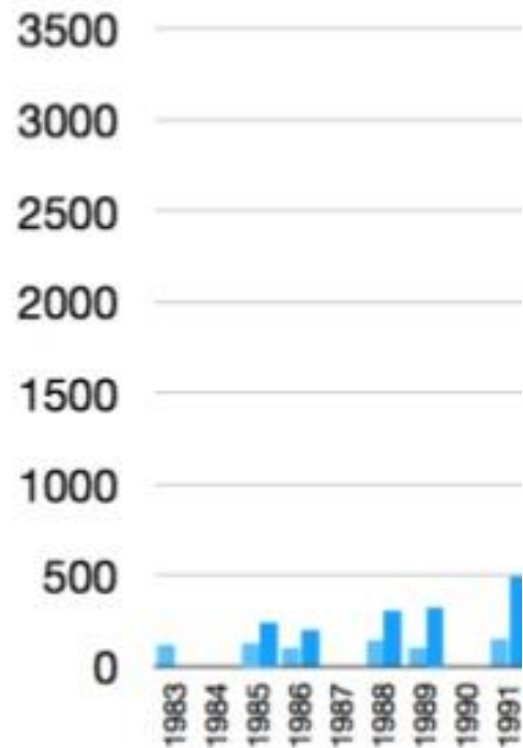
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	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35

HAIR WAS LOCATED AT (13, 23)
 L/EDGE WAS LOCATED AT (25, 13)
 R/EDGE WAS LOCATED AT (25, 28)
 L/EYE WAS LOCATED AT (22, 16)
 R/EYE WAS LOCATED AT (22, 23)
 NOSE WAS LOCATED AT (27, 20)
 MOUTH WAS LOCATED AT (29, 19)

The representation and matching of pictorial structures
 Fischler and Elschlager, 1973

Conference on Computer Vision and Pattern Recognition

Number of Papers



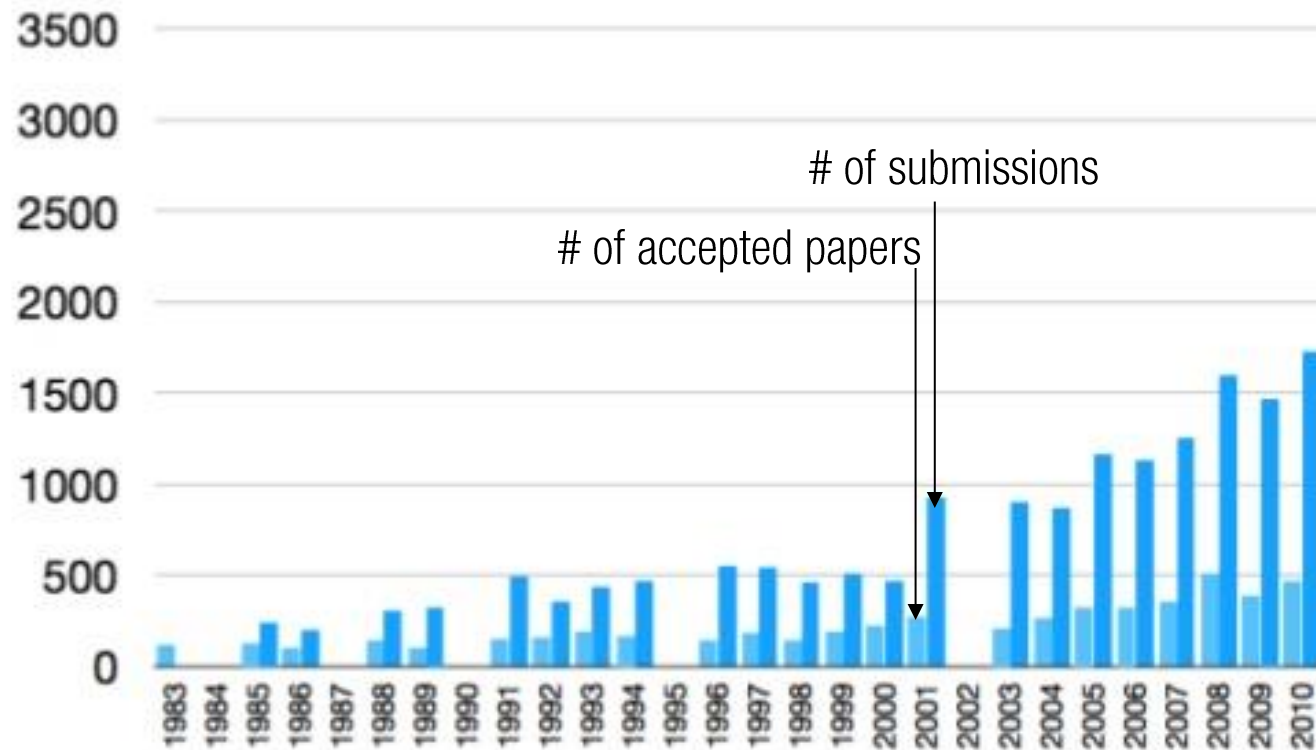
Takeo Kanade, CMU



Dana Ballard, U of Rochester

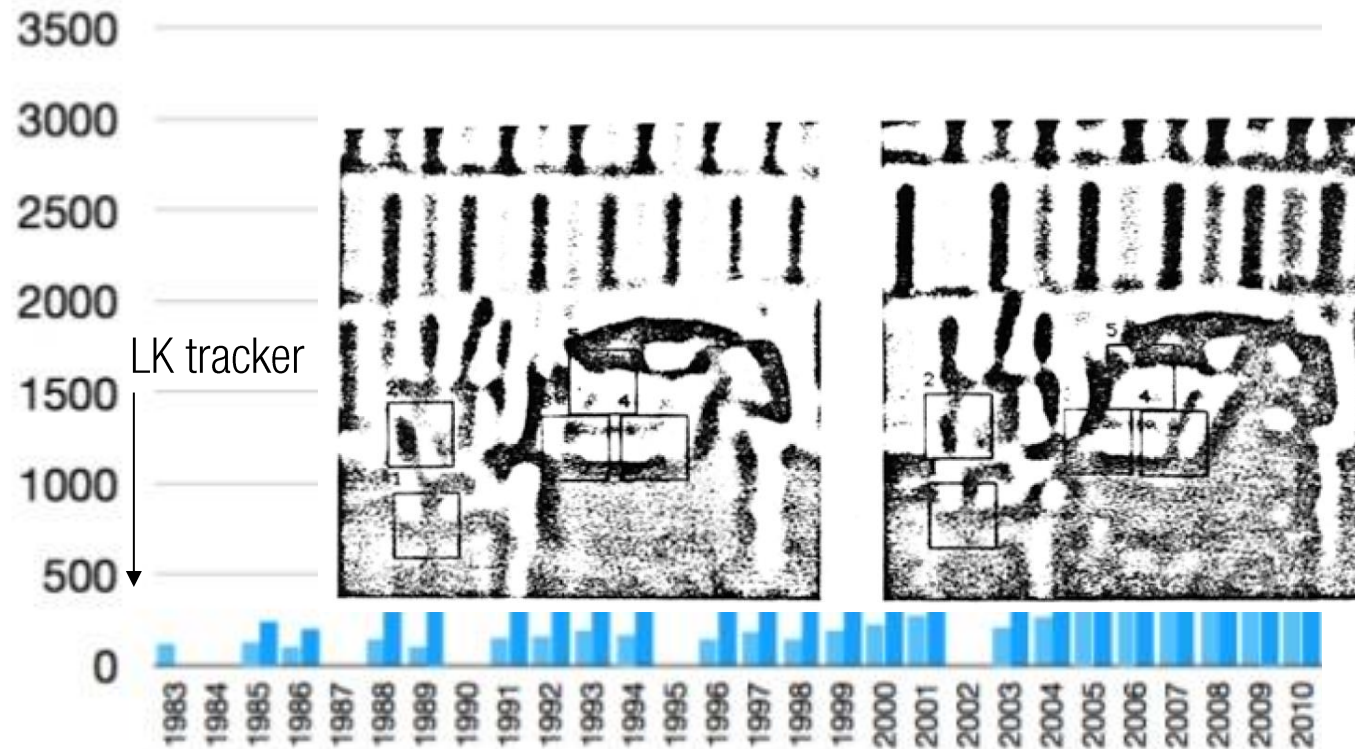
Conference on Computer Vision and Pattern Recognition

Number of Papers



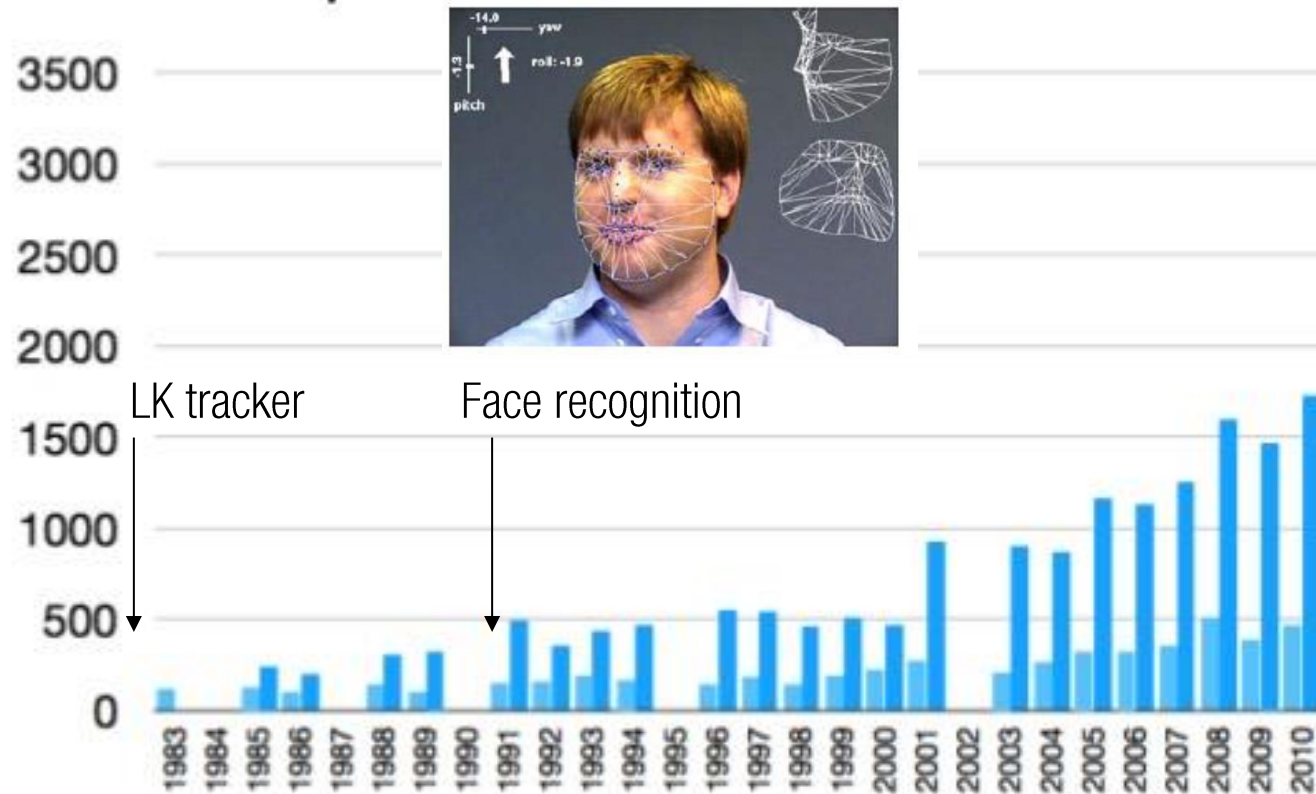
Conference on Computer Vision and Pattern Recognition

Number of Papers



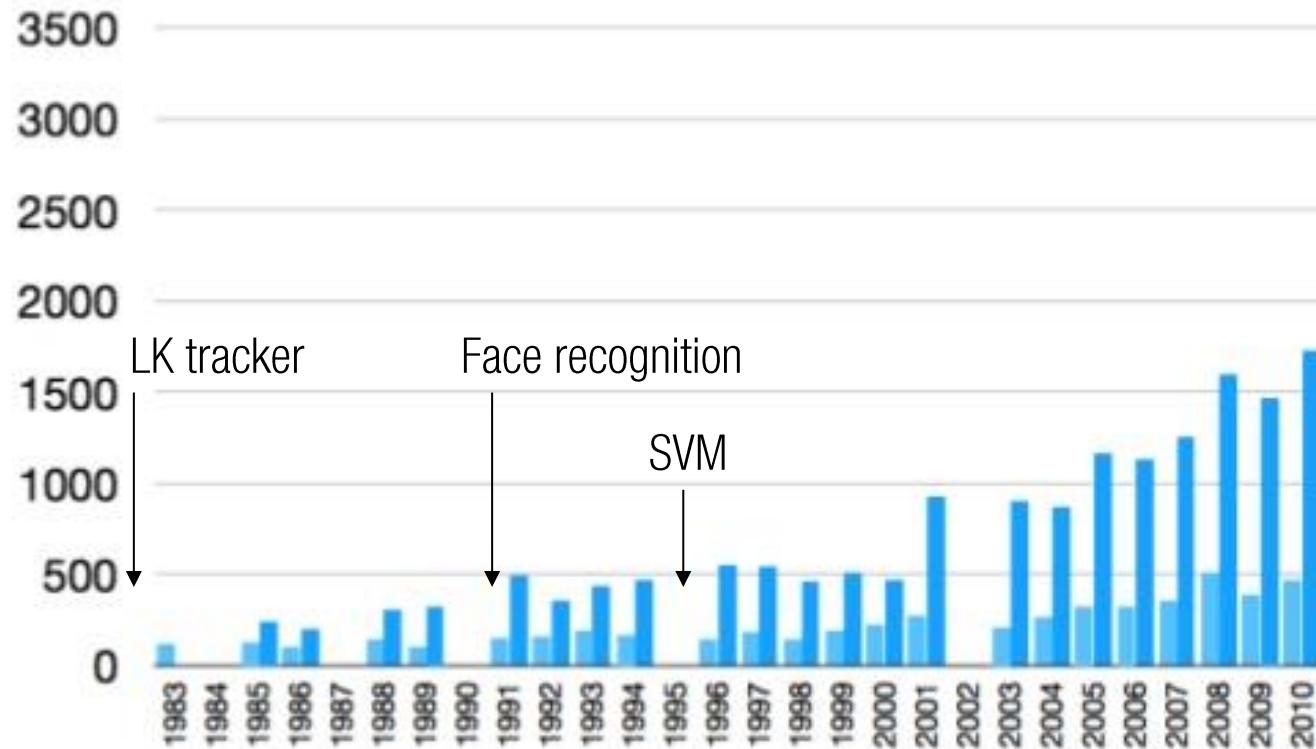
Conference on Computer Vision and Pattern Recognition

Number of Papers



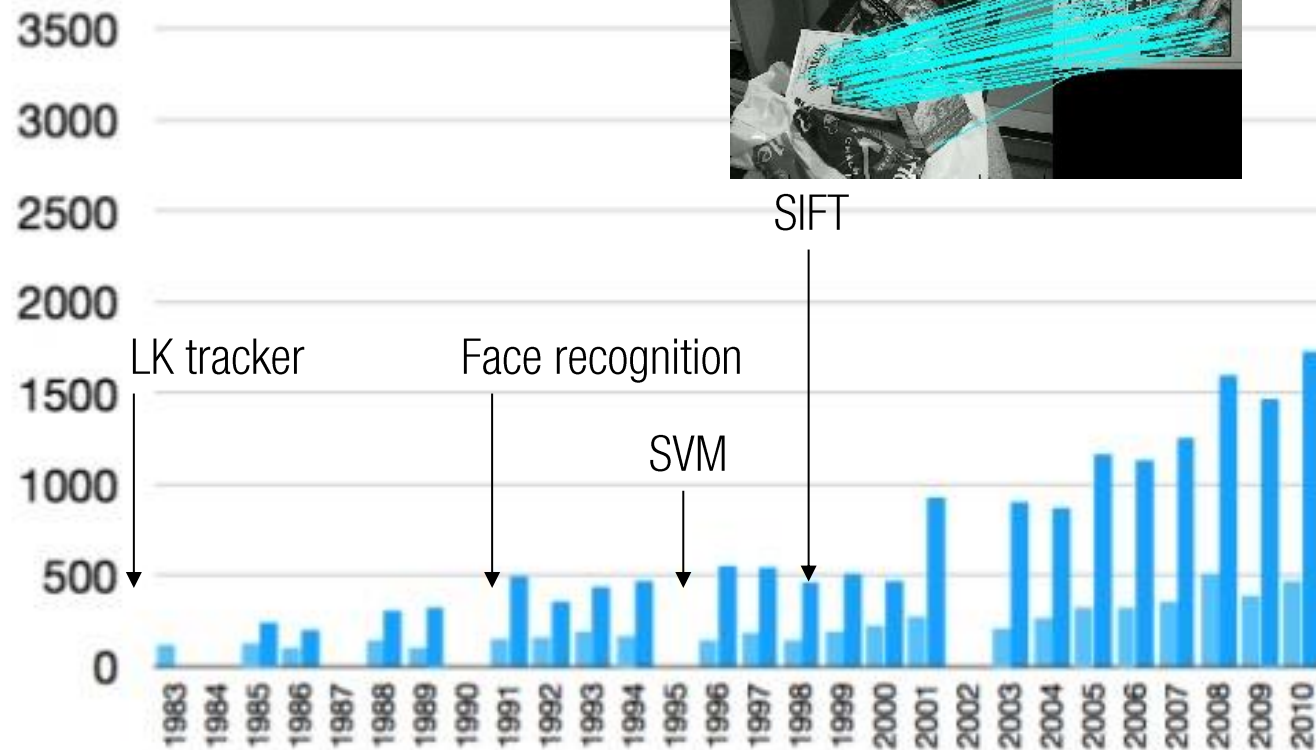
Conference on Computer Vision and Pattern Recognition

Number of Papers



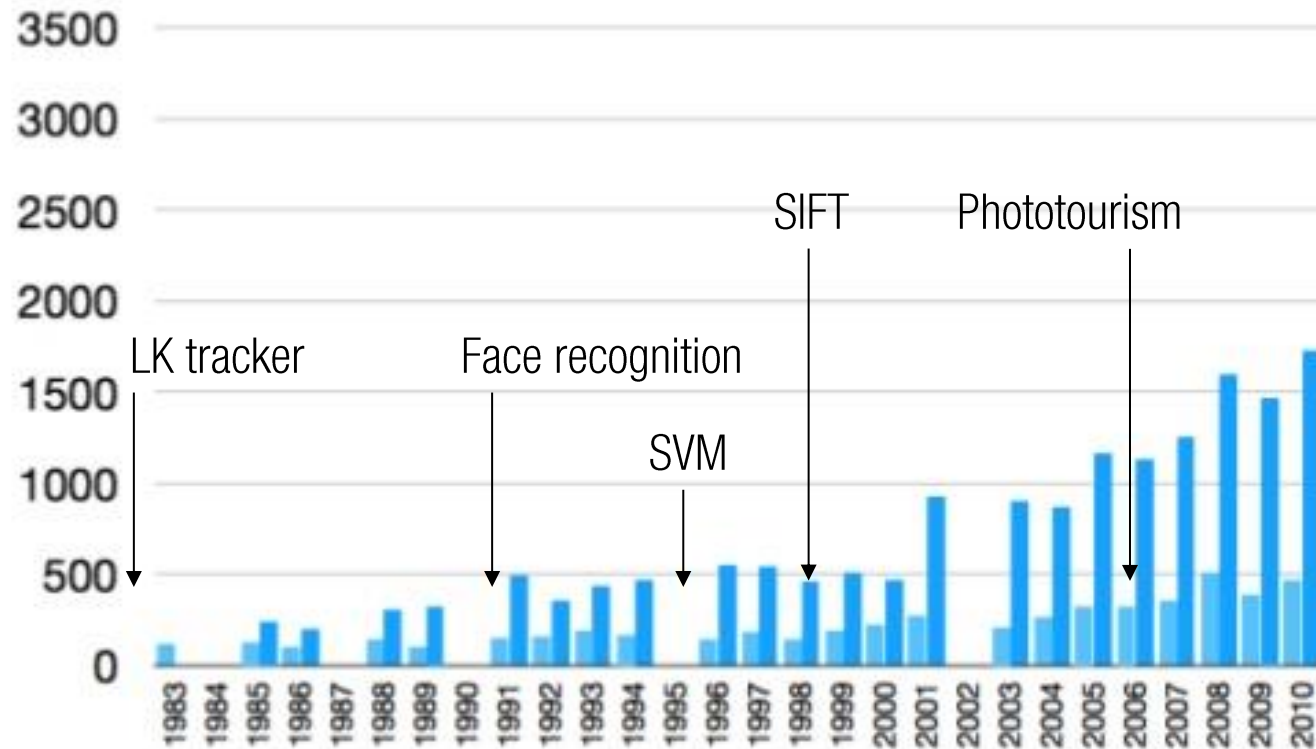
Conference on Computer Vision and Pattern Recognition

Number of Papers



Conference on Computer Vision and Pattern Recognition

Number of Papers



Conf

Nun

350

300

250

200

150

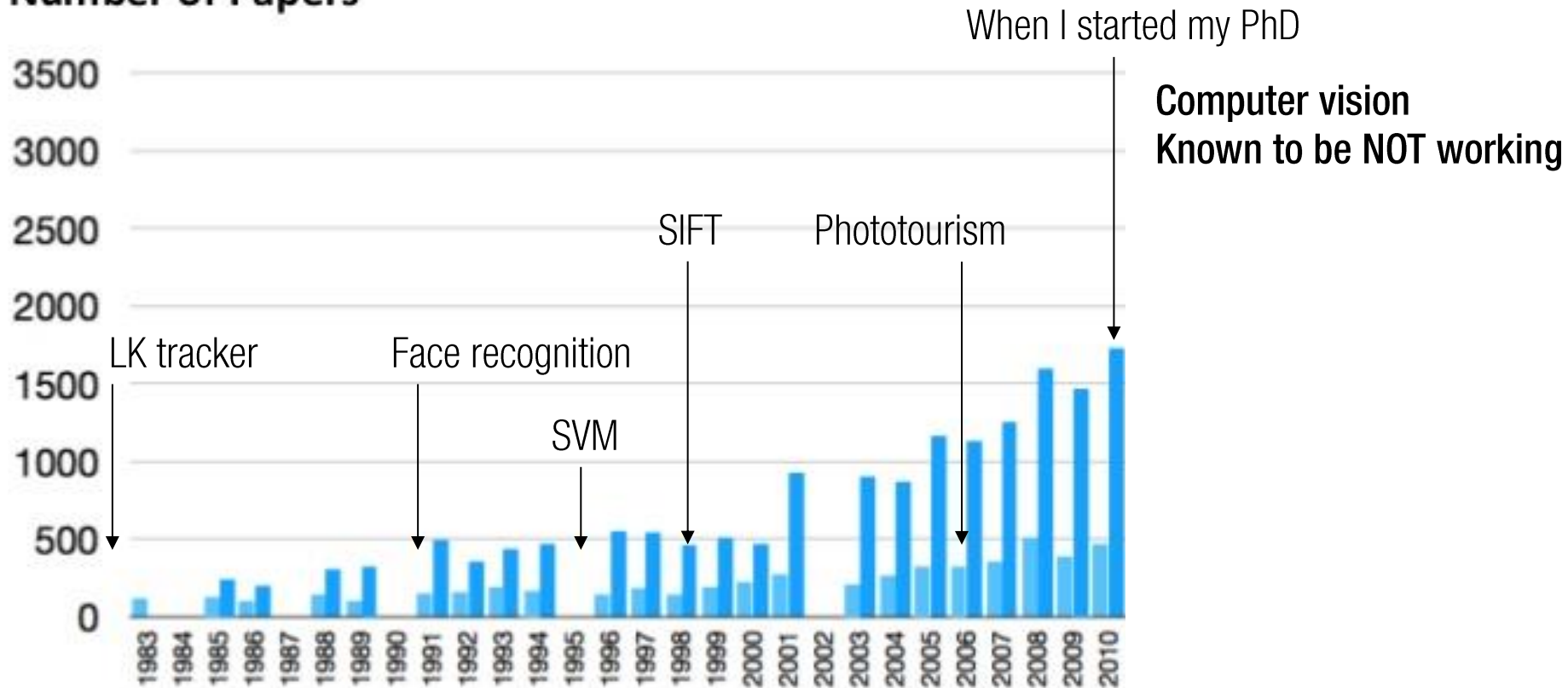
100

50



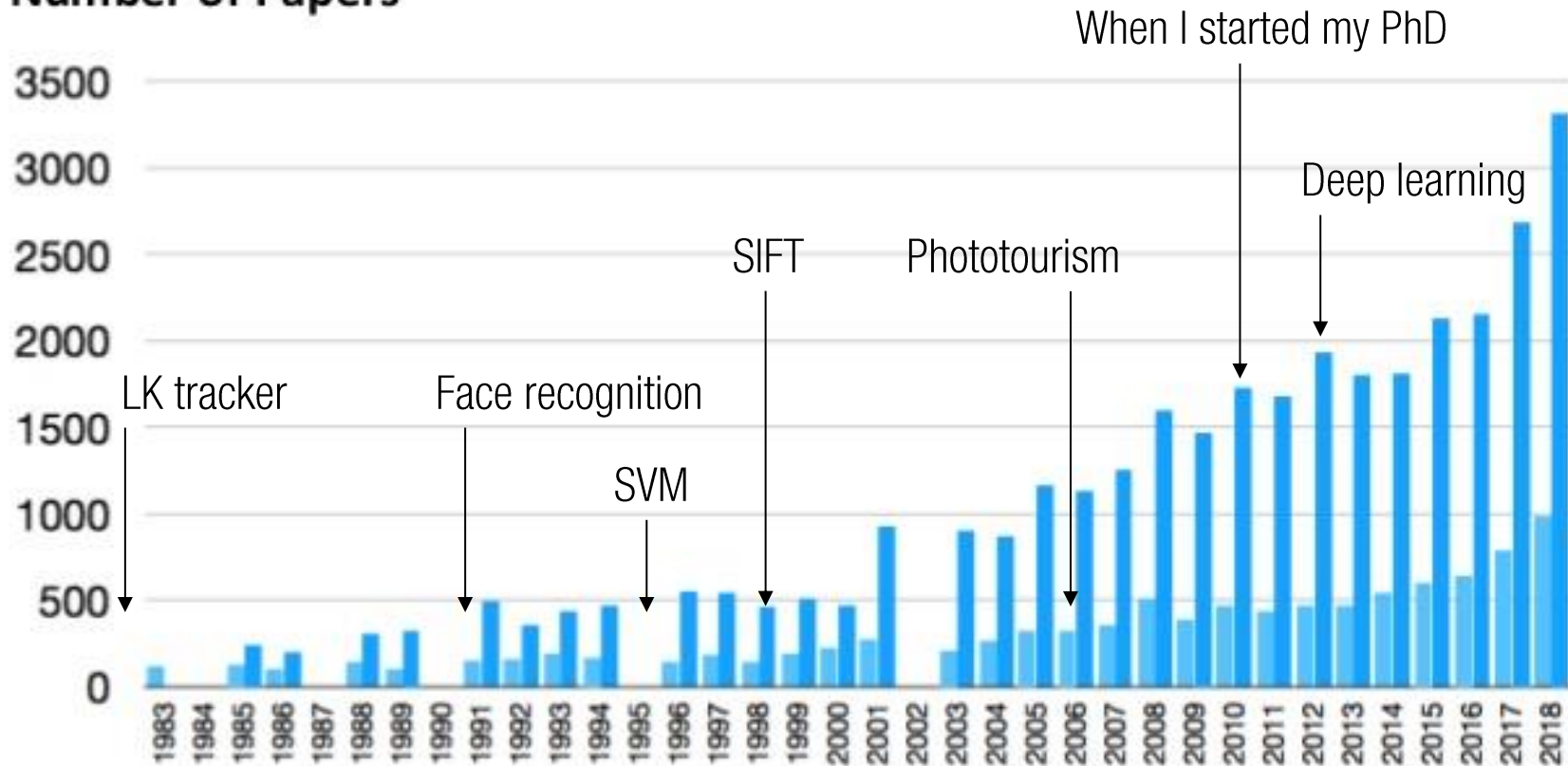
Conference on Computer Vision and Pattern Recognition

Number of Papers



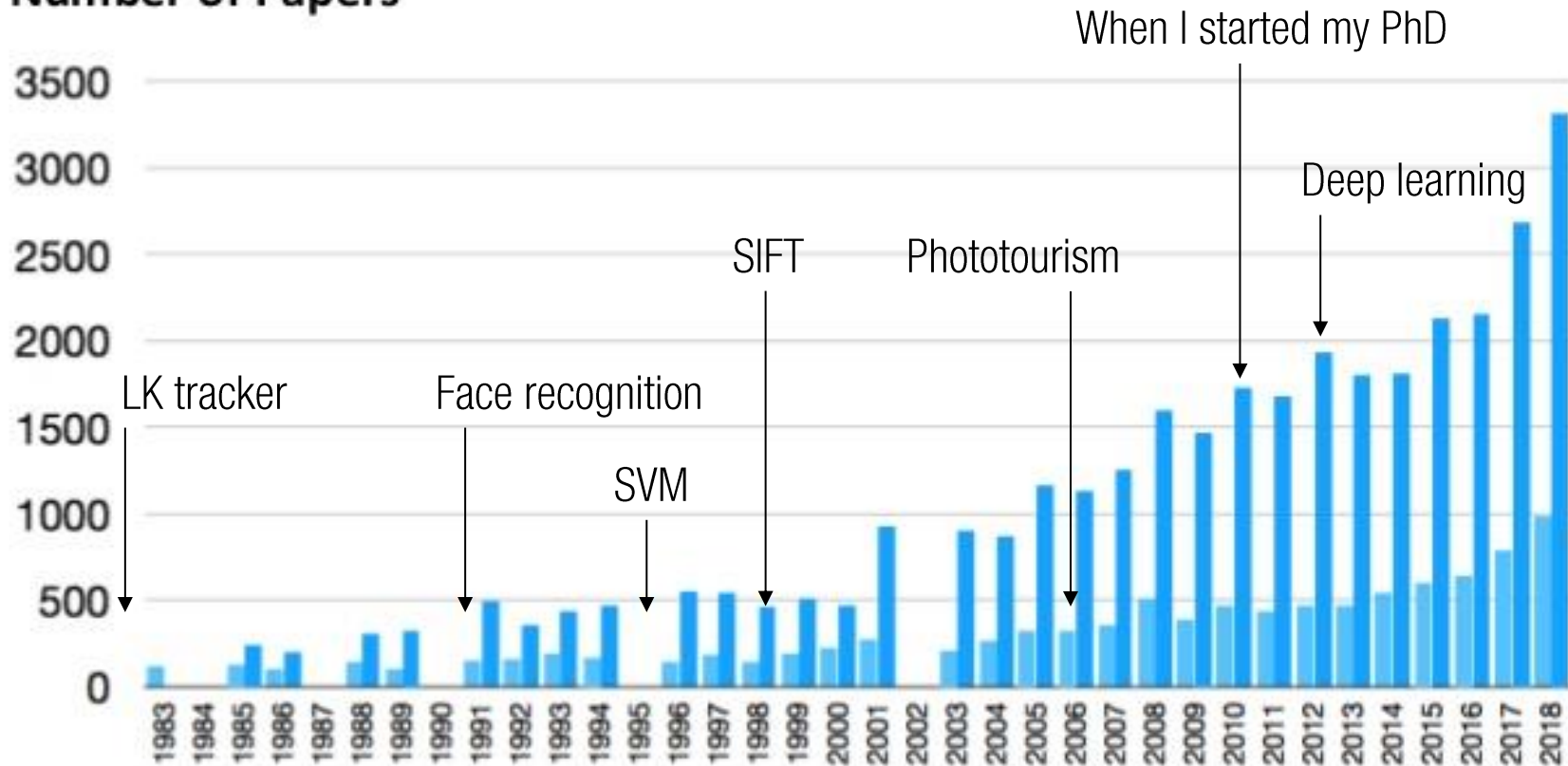
Conference on Computer Vision and Pattern Recognition

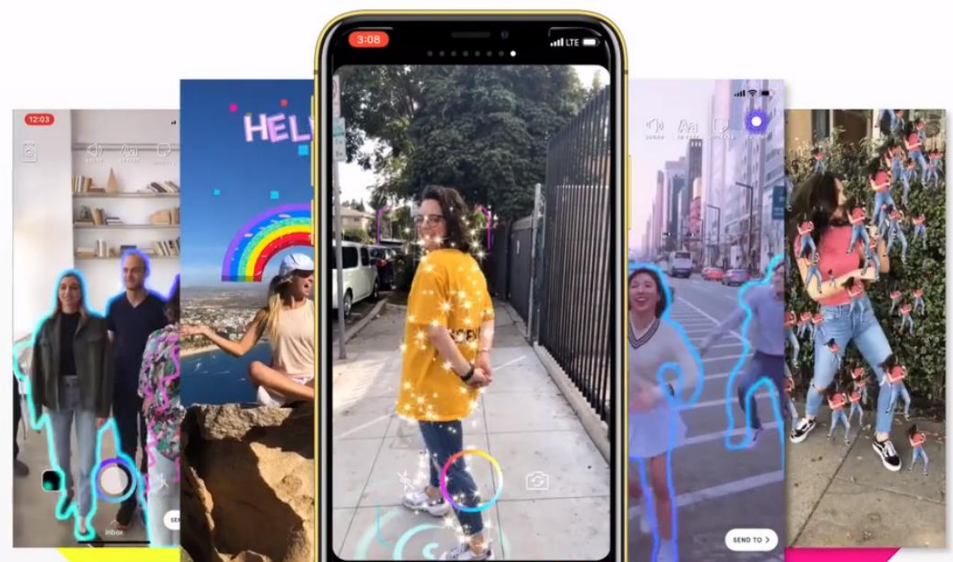
Number of Papers



Conference on Computer Vision and Pattern Recognition

Number of Papers







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Gold Sponsors



Silver Sponsors



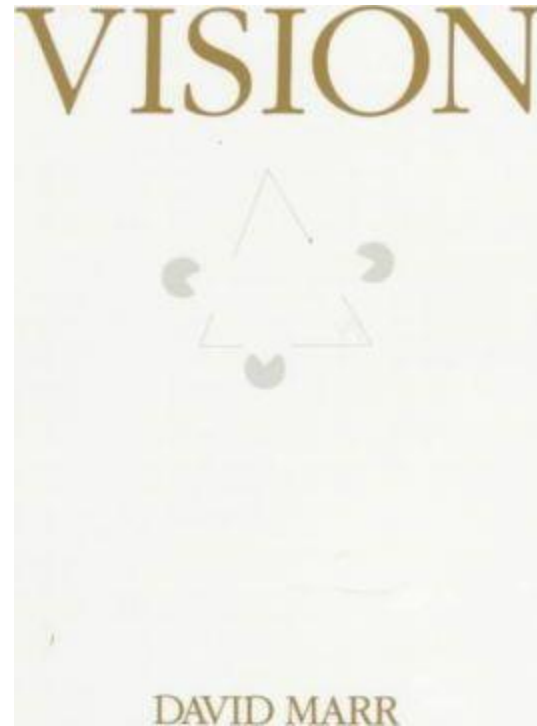
CVPR sponsor (2018)

HOW TO MAKE A COMPUTER TO UNDERSTAND AN IMAGE?

MARR'S VISION



David Marr (1945-1980)



1982

THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

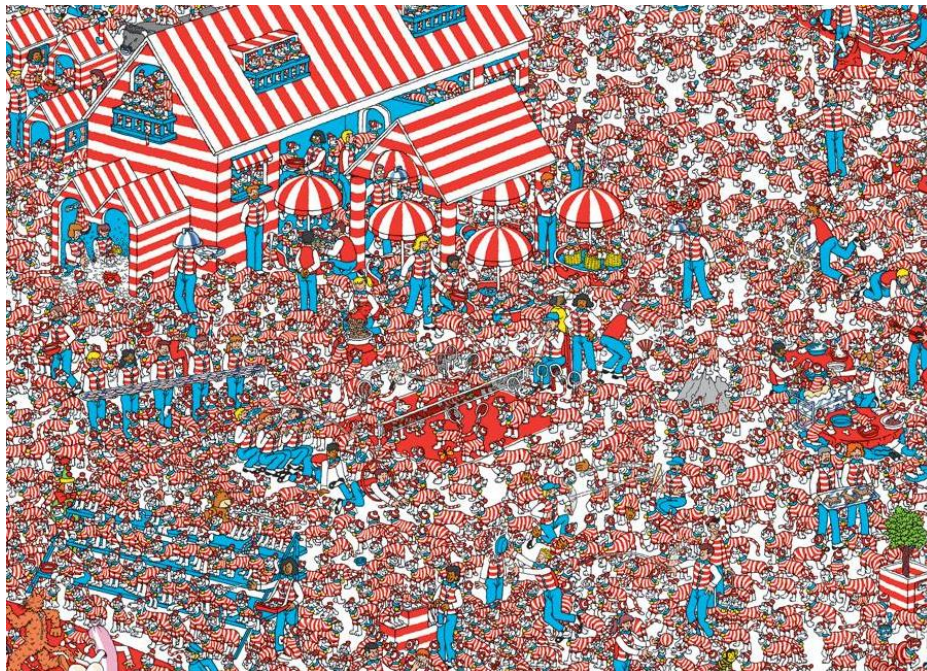
THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

1. Computational

e.g., what is the goal of the computation?



How to computationally find Waldo?

THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

1. Computational

e.g., what is the goal of the computation?

How to formulate the objective:

$$\underset{p}{\text{minimize}} \sum_{\mathbf{x}} (J(w(\mathbf{x}; p)) - T(\mathbf{x}))^2$$

THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

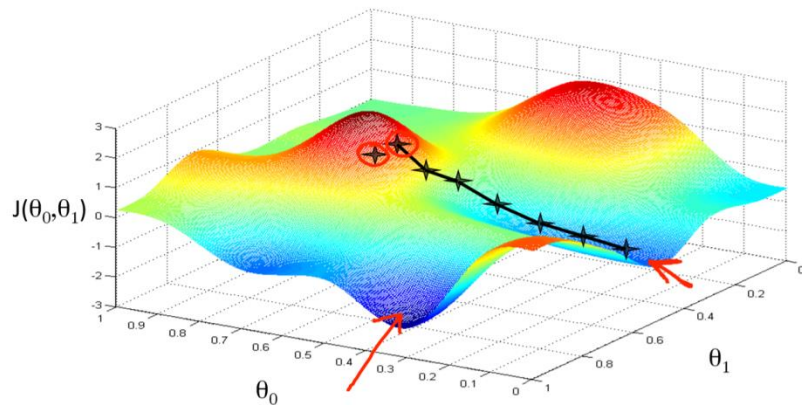
1. Computational

e.g., what is the goal of the computation?

How to formulate the objective:

$$\text{minimize}_p \sum_{\mathbf{x}} (J(w(\mathbf{x}; p)) - T(\mathbf{x}))^2$$

How to achieve the objective:



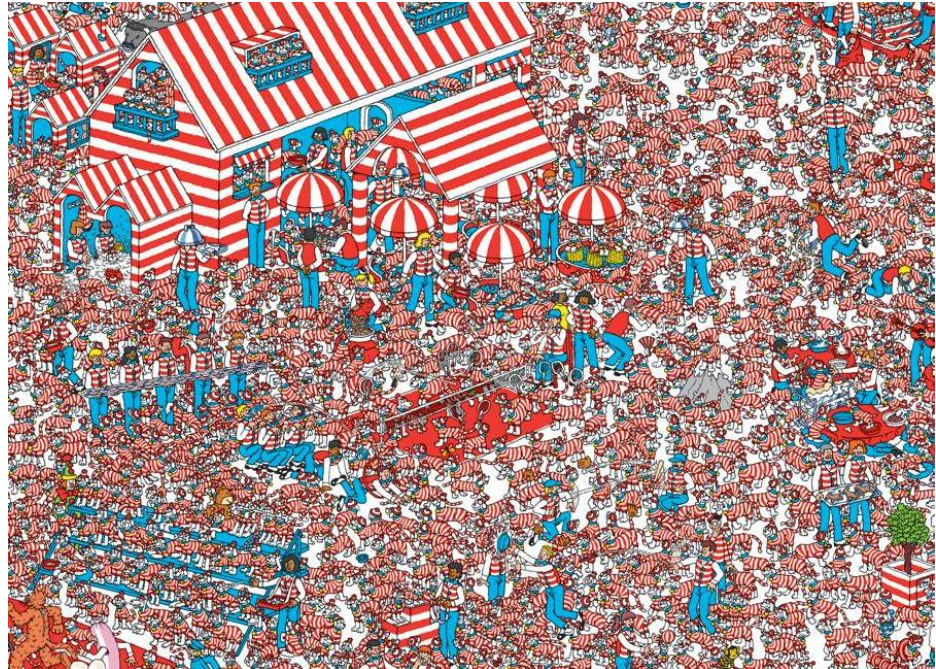
THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

2. Algorithmic

e.g., what representation can implement the computation?



How to represent the image?

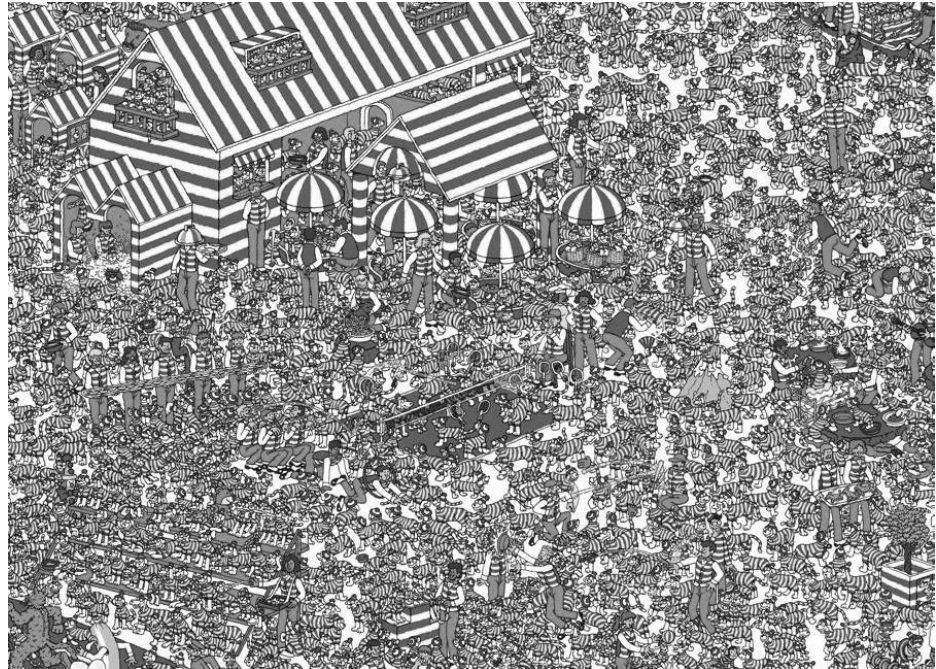
THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

2. Algorithmic

e.g., what representation can implement the computation?



How to represent the image?

THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

2. Algorithmic

e.g., what representation can implement the computation?

78	99	108	106	117	117	149	205	206	169	109	118	147	150	155	217	222	233
78	98	106	104	116	115	148	205	206	169	109	118	147	150	155	217	222	233
78	103	113	111	121	120	151	207	208	170	108	117	146	149	154	217	223	233
74	145	176	170	164	158	183	226	229	178	93	103	134	136	143	224	233	239
62	147	184	177	169	161	187	227	230	178	90	101	133	134	142	225	234	240
159	165	168	167	165	158	187	236	239	188	101	111	135	136	143	225	234	240
226	179	158	162	162	157	189	244	247	195	108	118	136	137	144	226	235	240
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223	222	213	197
111	109	123	145
114	112	125	145
222	222	226	233
253	252	254	255
248	248	250	254
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246	246	247	249
245	245	248	251
245	244	248	253
245	243	248	254
249	248	248	246
254	255	248	235
253	253	248	238

How to represent the image?

THREE LEVELS OF VISUAL PERCEPTION



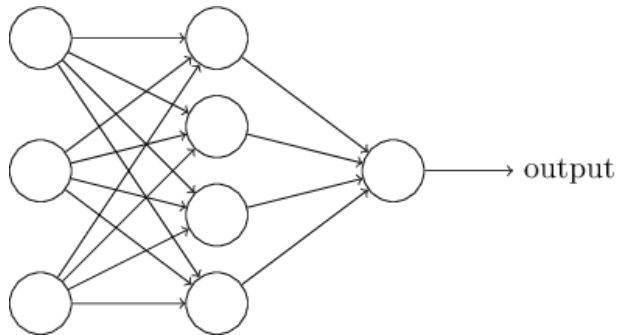
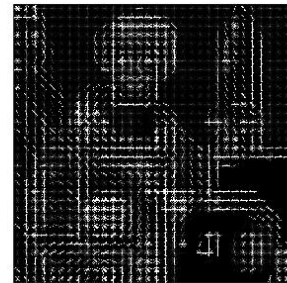
David Marr (1945-1980)

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78	99	108	106	117	117	149	205	206	169	109	110	147	150	155	217	222	233
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155	112	92	91	171	200	212	240	245	187	86	98	110	109	118	223	234	239
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141	110	96	93	174	205	212	234	239	184	90	101	119	119	127	223	234	240
85	100	106	99	187	224	216	213	220	176	102	111	147	150	155	226	234	240
87	100	105	98	186	223	216	215	221	176	102	112	146	148	154	226	234	240
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117	151	166	160	213	240	209	164	173	135	69	81	135	140	146	215	222	232
115	148	142	156	211	239	210	167	174	139	70	81	136	141	146	216	223	233
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222	238	246	248	202	190	147	66	71	88	115	110	174	180	183	228	232	240
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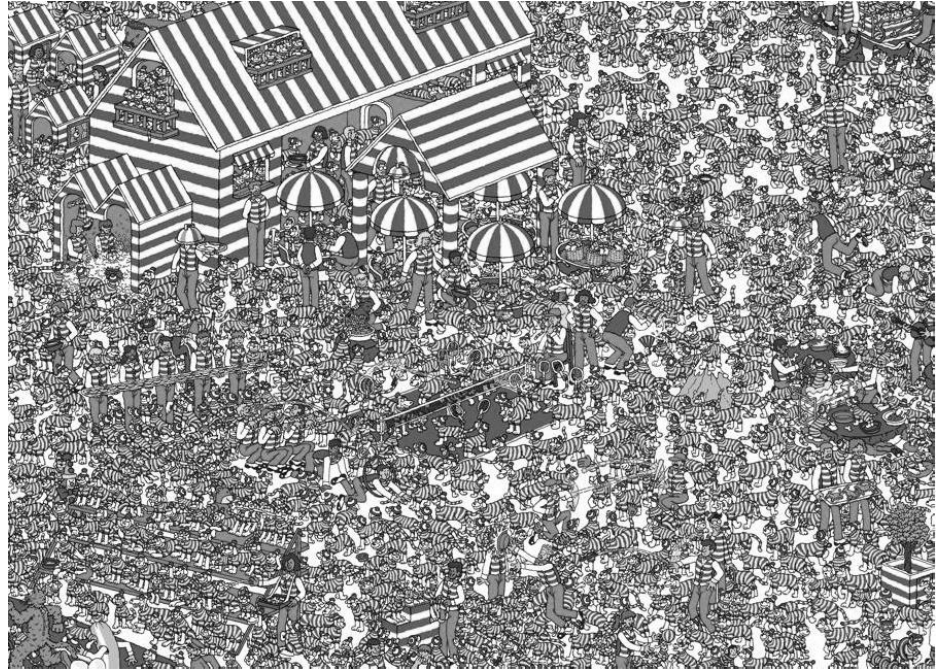
THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

3. Implementational

e.g., how hardware can carry out such computation?



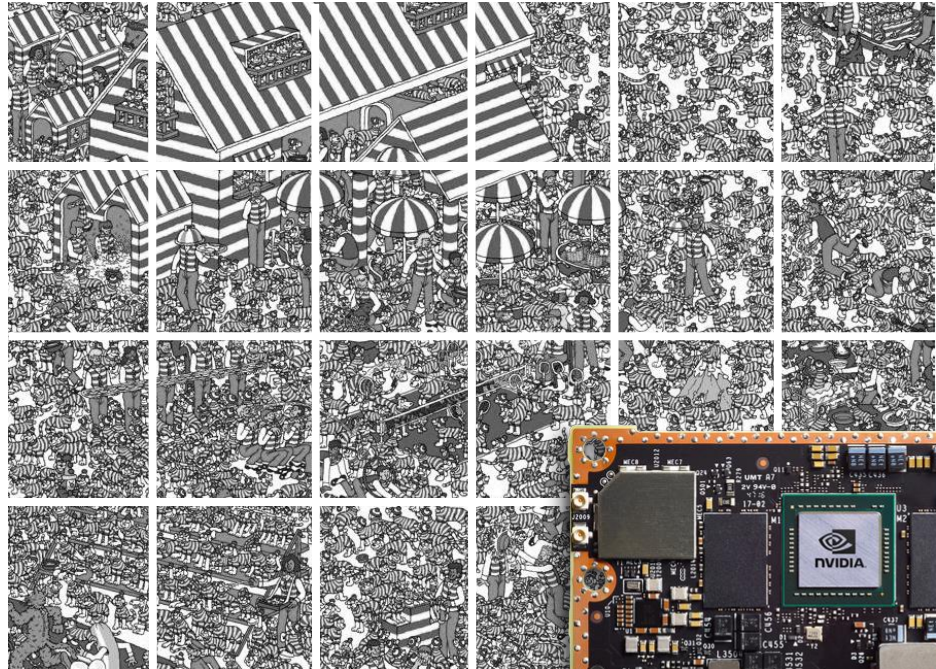
THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

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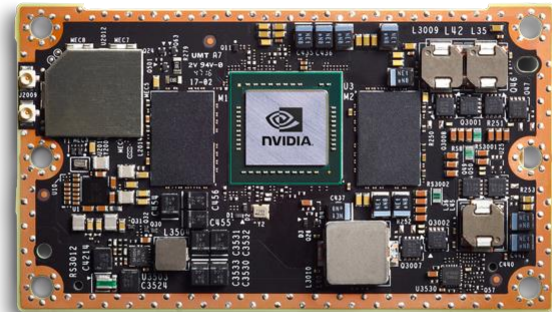
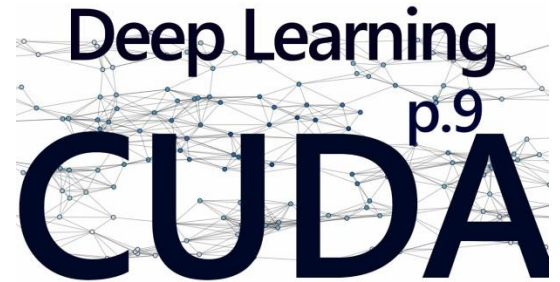
THREE LEVELS OF VISUAL PERCEPTION



David Marr (1945-1980)

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THREE LEVELS OF VISUAL PERCEPTION

3. Implementational

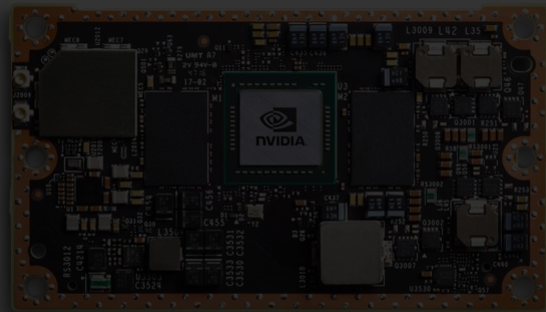
e.g., how hardware can carry out such computation?

BEYOND THE SCOPE OF THIS COURSE.



Deep Learning
p.9
CUDA

David Marr (1945-1980)



WHAT WILL BE COVERED?

Basics and 4 Rs of Computer Vision

BASICS

Image formation

Image convolution/filtering

Feature representation

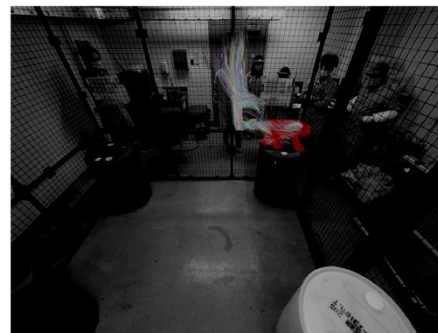
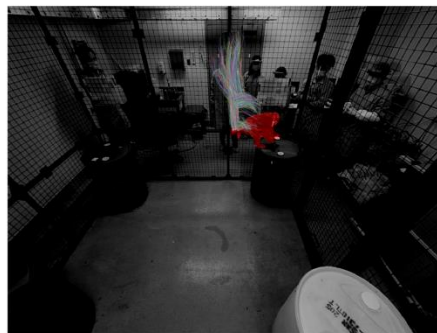
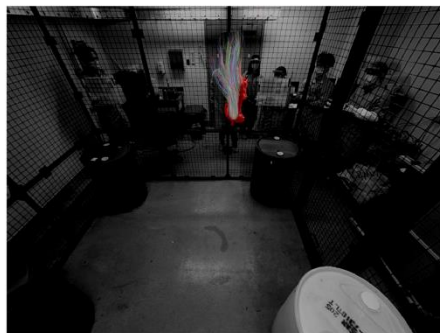
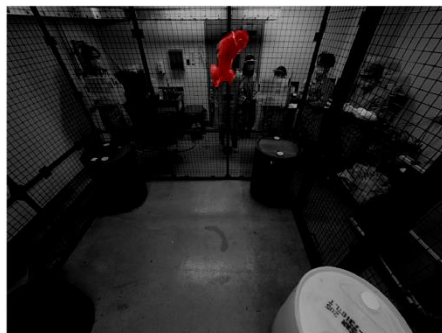


4 Rs: REGISTRATION

Optical flow

Image alignment

Tracking



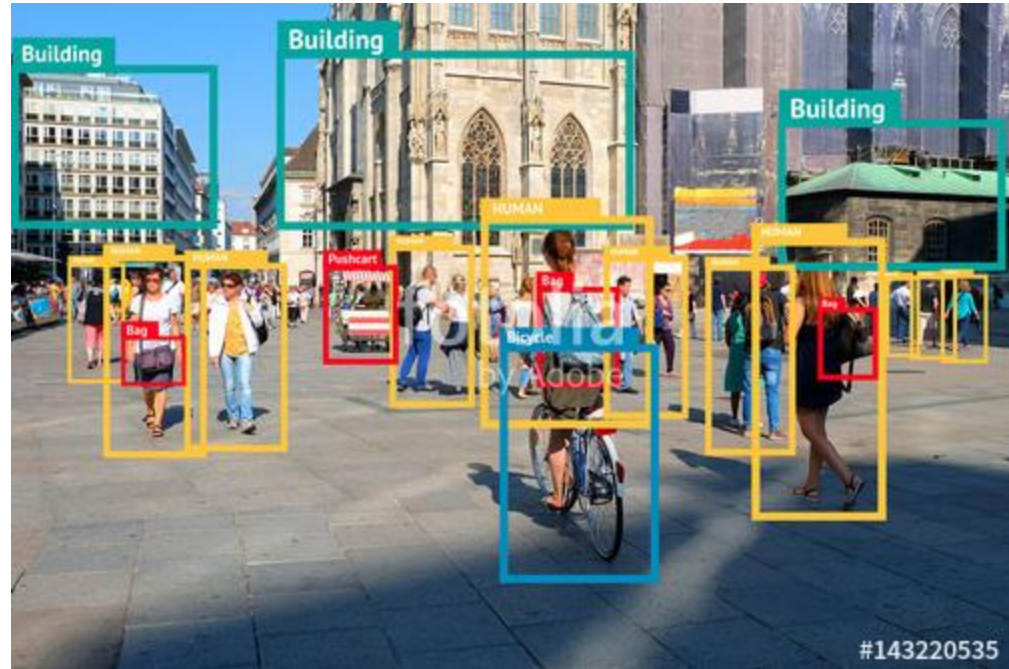
4 Rs: RECOGNITION

Bag of feature

Template matching

Object proposal

Convolutional neural network



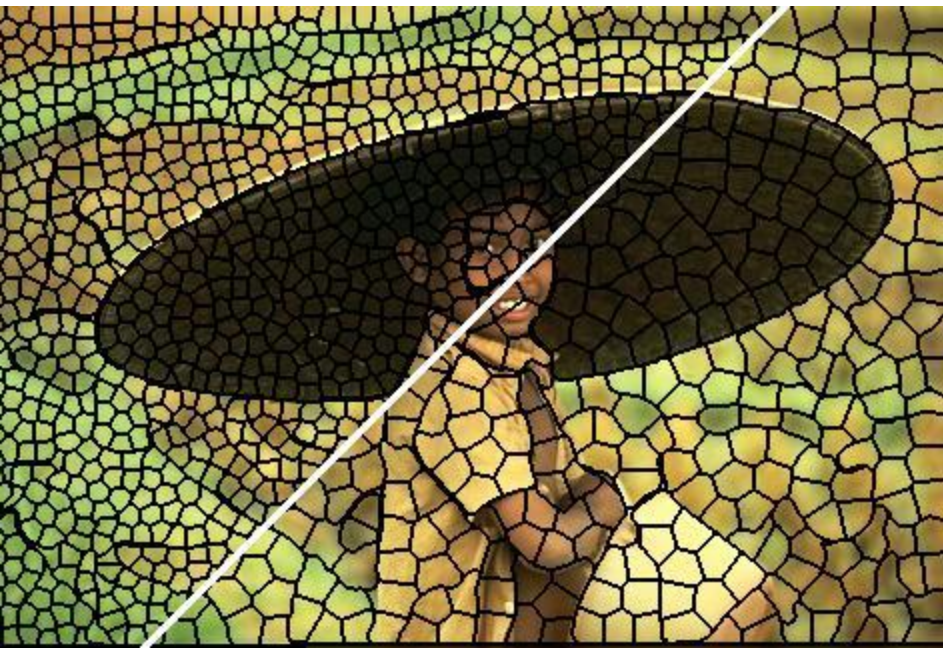
#143220535

4 Rs: REORGANIZATION

Graph cuts

Superspixel

Semantic segmentation



- HeadTop/neck/bodyCenter
- Left shoulder/elbow/wrist
- Right shoulder/elbow/wrist
- Left hip/knee/ankle
- Right hip/knee/ankle

4 Rs: RECONSTRUCTION

Camera geometry
Epipolar geometry
Stereo



3D Motion Reconstruction
(Trajectory Stream Association)



WHAT WILL NOT BE COVERED?

WHAT WILL NOT BE COVERED?

- Basic Machine Learning knowledge
- MATLAB / Python programming
- Linear algebra / Calculus

WHAT WILL NOT BE COVERED?

- Basic Machine Learning knowledge
- MATLAB / Python programming
- Linear algebra / Calculus

Tips:

1. Drop this course if you are not fluent on these materials--you will be embarrassed if you ask these even during office hours.
2. Drop this course if you are not confident on mathematical programming, e.g., translating math concept to code.
3. Drop this course if you are not comfortable on debugging and the usage of debugging tools.
4. Study by yourself and read relevant materials (e.g., book, wikipedia, coursera).

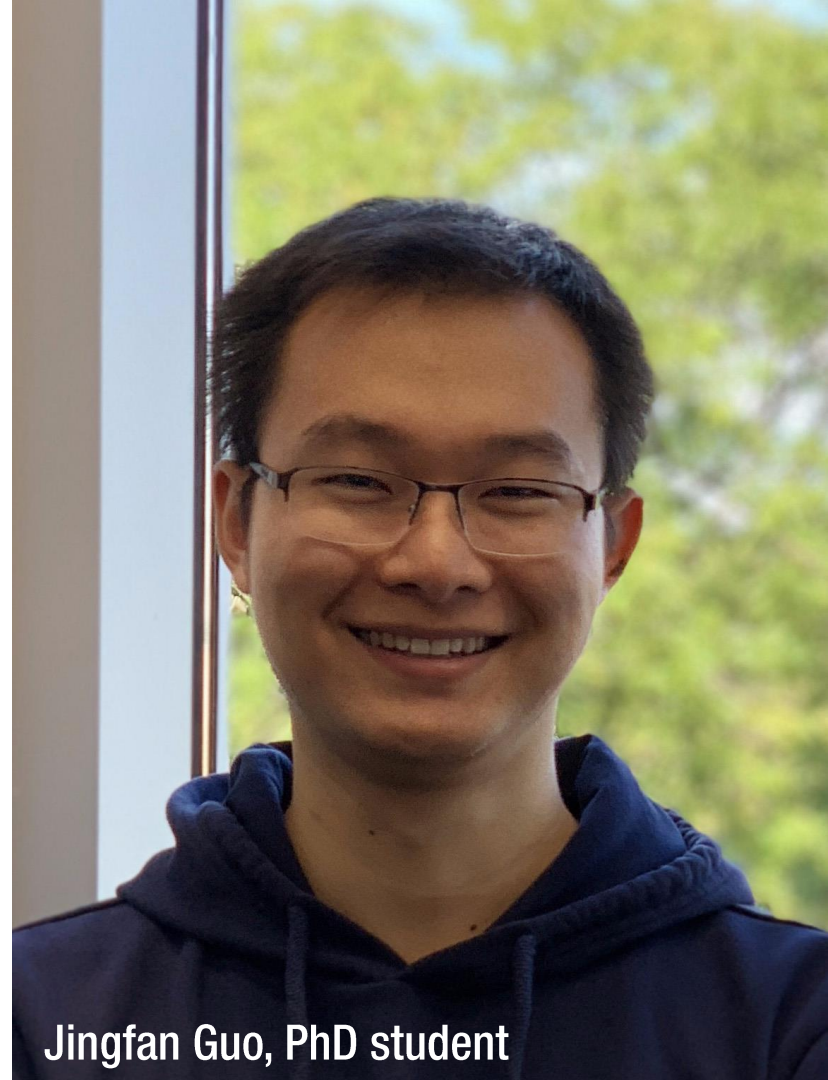
EVALUATION

- 5 programming assignments (15% each)
 - Late submission: 20% off from each extra late day
- 1 final written exam (25%): May 1st during the lecture time

No make-up assignment and exam

OFFICE HOUR

- Hyun Soo Park: MW 4-5pm @ Shepherd 261
- Jingfan Guo: TTh 4-5pm @ Shpherd 234



Jingfan Guo, PhD student

COURSE WEBSITE

<https://www-users.cs.umn.edu/~hspark/csci5561/csci5561.html>

Spring 2019 CSCI 5561
Computer Vision

Mon/Wed 9:45am-11:00am @ Keller Hall 3-111

- Syllabus
- Schedule
- Lecture slide

Information

Syllabus

Instructor: [Hyun Soo Park](mailto:hspark@umn.edu) (hspark at umn.edu)

Office hour: Mon/Wed 4:00pm-5:00pm (Shepherd Laboratory 261)

TA: [Jingfan Guo](mailto:guo00109@umn.edu) (guo00109 at umn.edu)

Office hour: Tue/Thr 4:00pm-5:00pm (Shepherd Laboratory 234)

While only 5511 is listed as a prerequisite, **I will assume that all students are fluent on the following subjects** (we don't have time to cover in the lectures):

- + MATLAB/Python usage for image handling
- + Linear algebra
- + Calculus
- + Machine learning

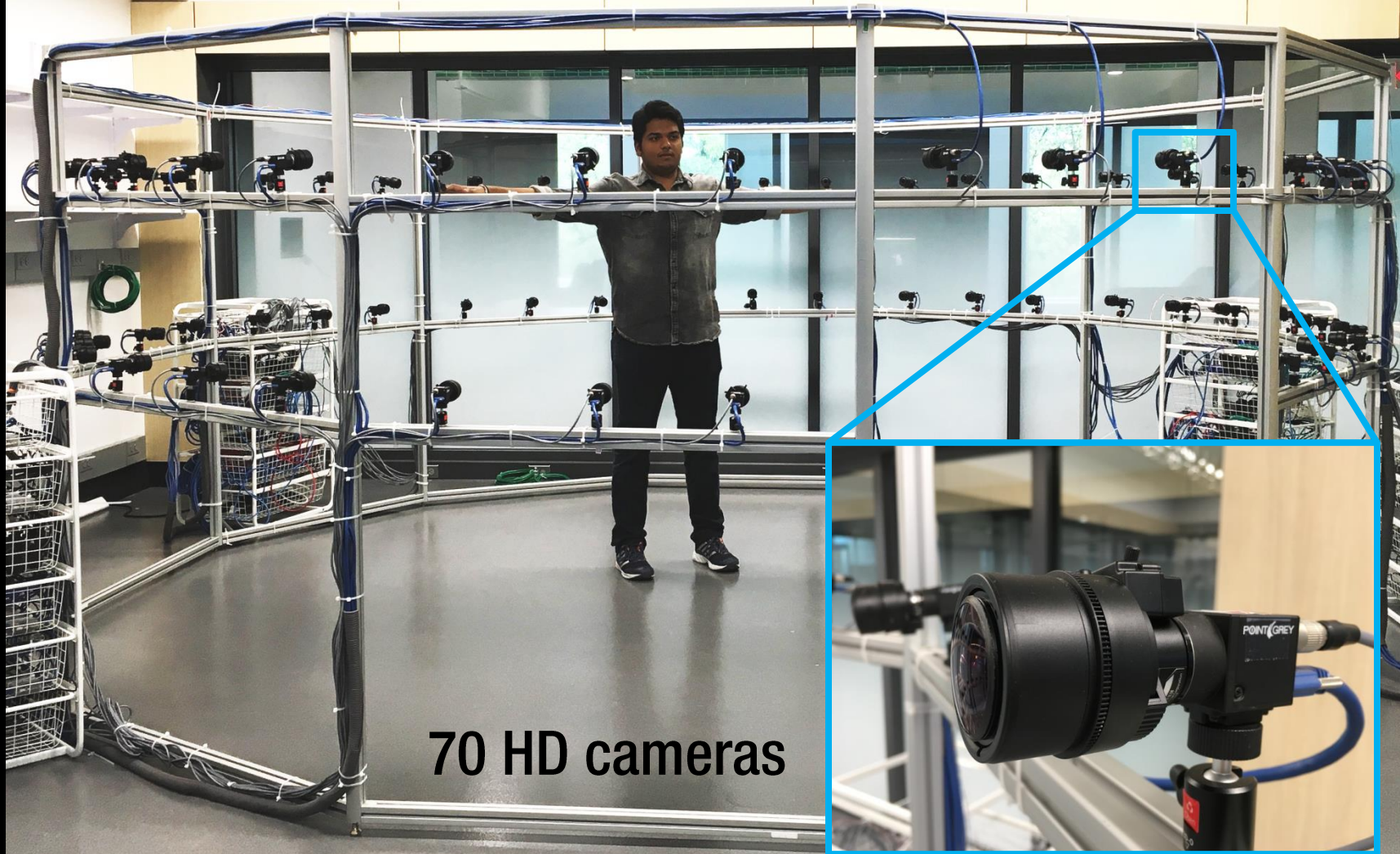
Textbook: Not required but the following books will be frequently referred:

- + "Computer Vision: Algorithms and Applications", Richard Szeliski
- + "Computer Vision: A Modern Approach", David A. Forsyth and Jean Ponce

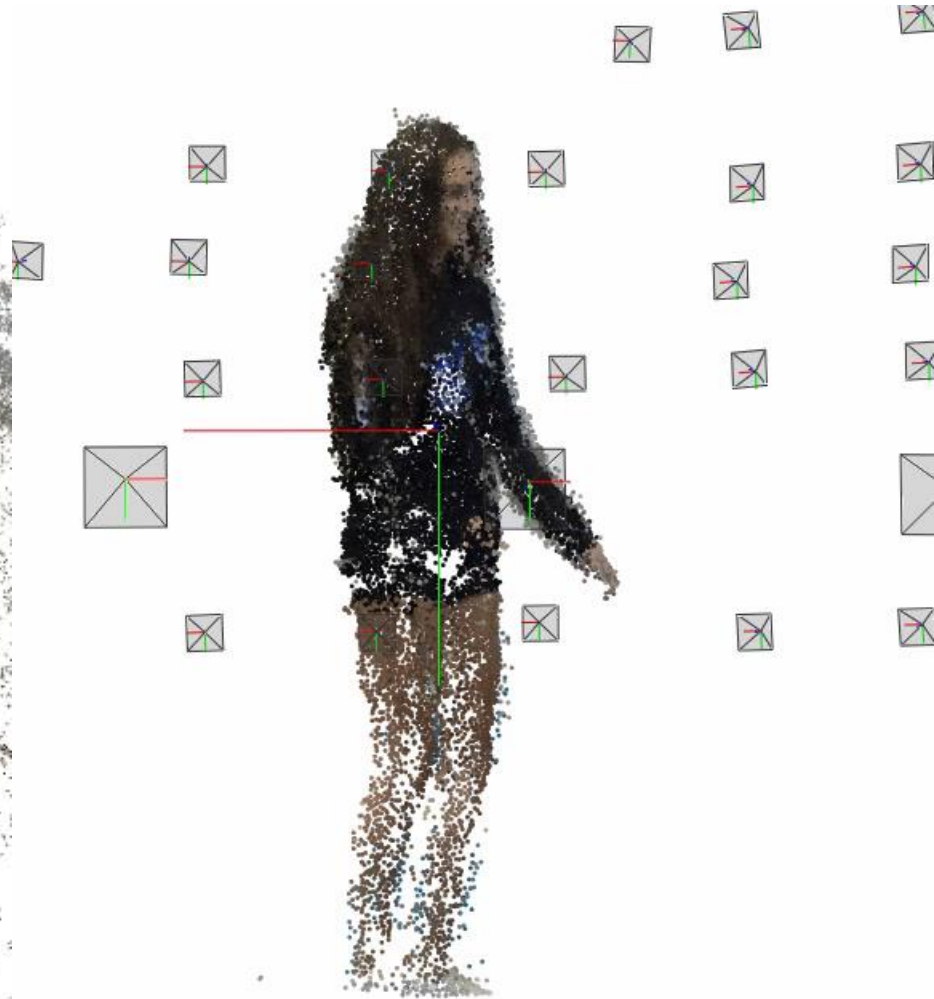
Topics:

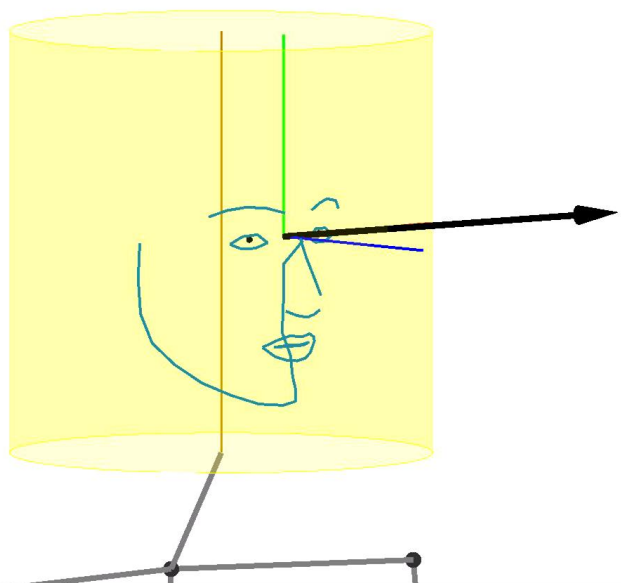
- + Visual representation
 - Image formation
 - Image transformation
 - Image filtering/convolution
 - Image feature

WHO AM I?

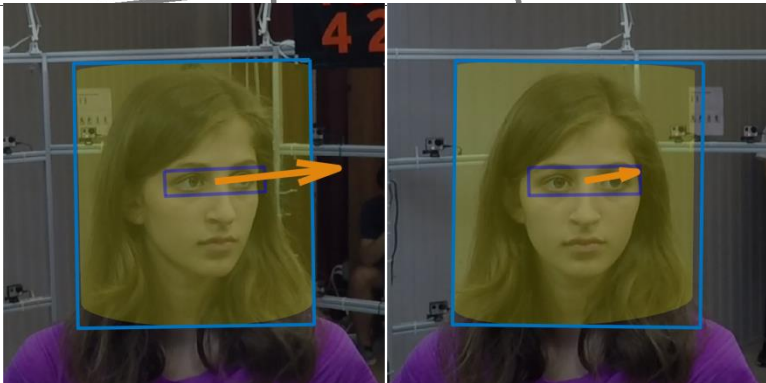
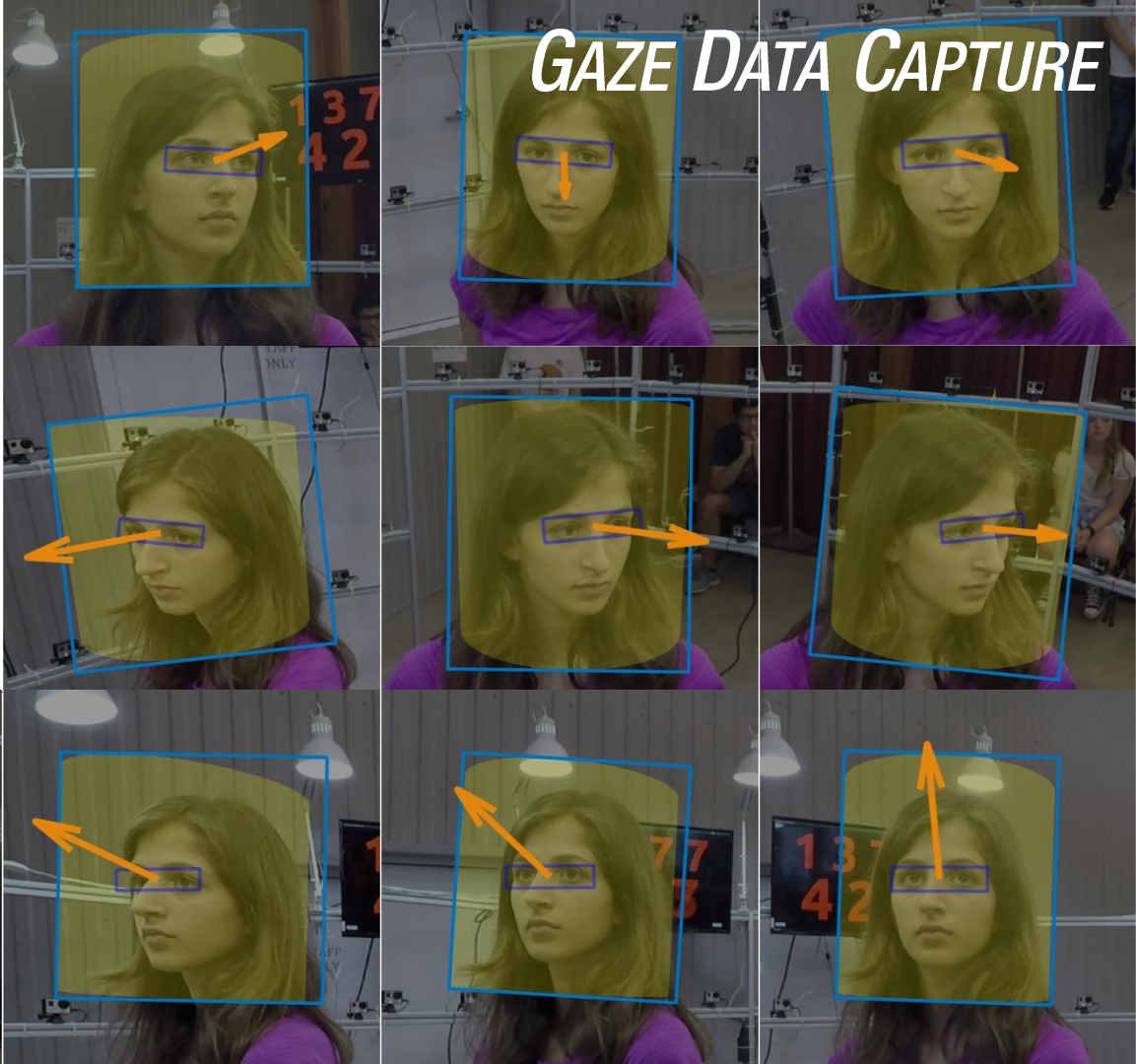


70 HD cameras

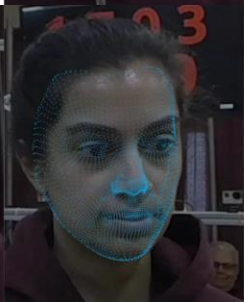
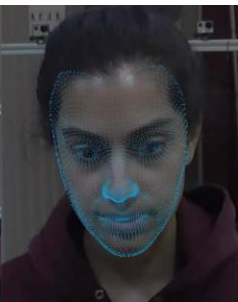
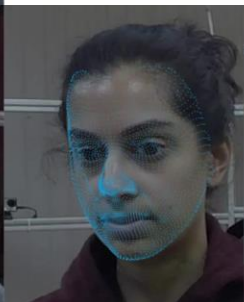
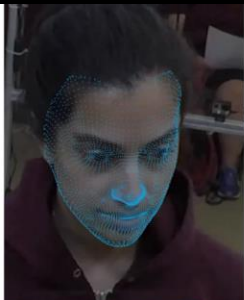
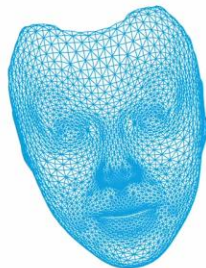
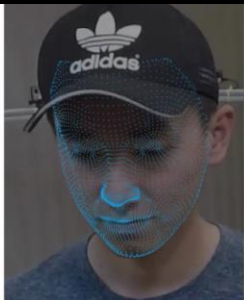
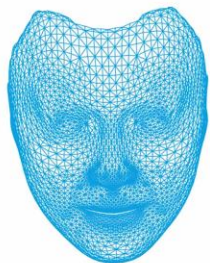




GAZE DATA CAPTURE



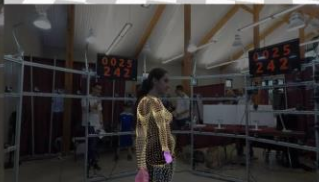
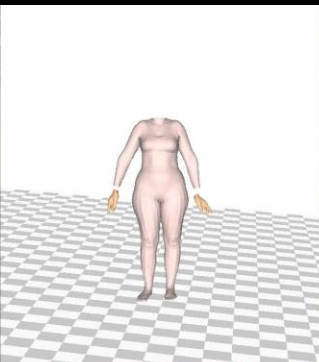
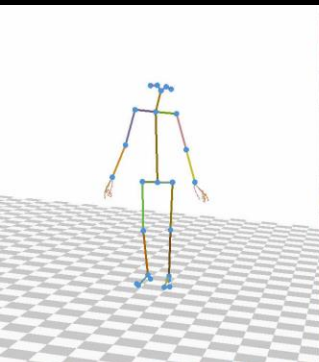
FACE DATA CAPTURE



BODY DATA CAPTURE



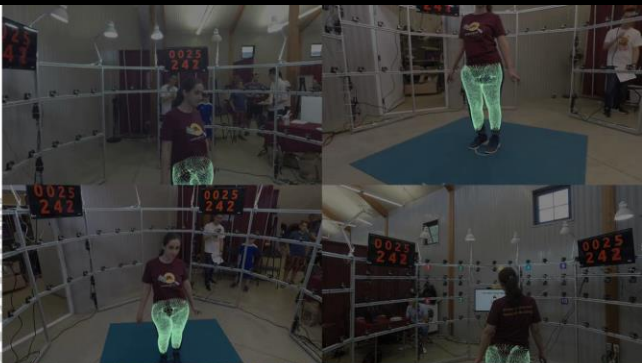
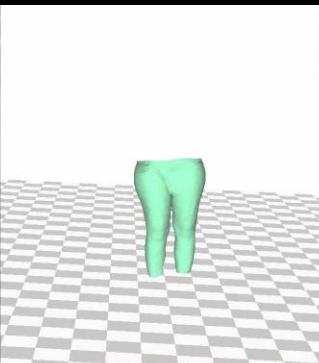
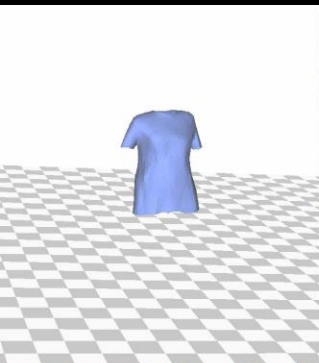
BODY DATA CAPTURE



Skeleton

Body skin

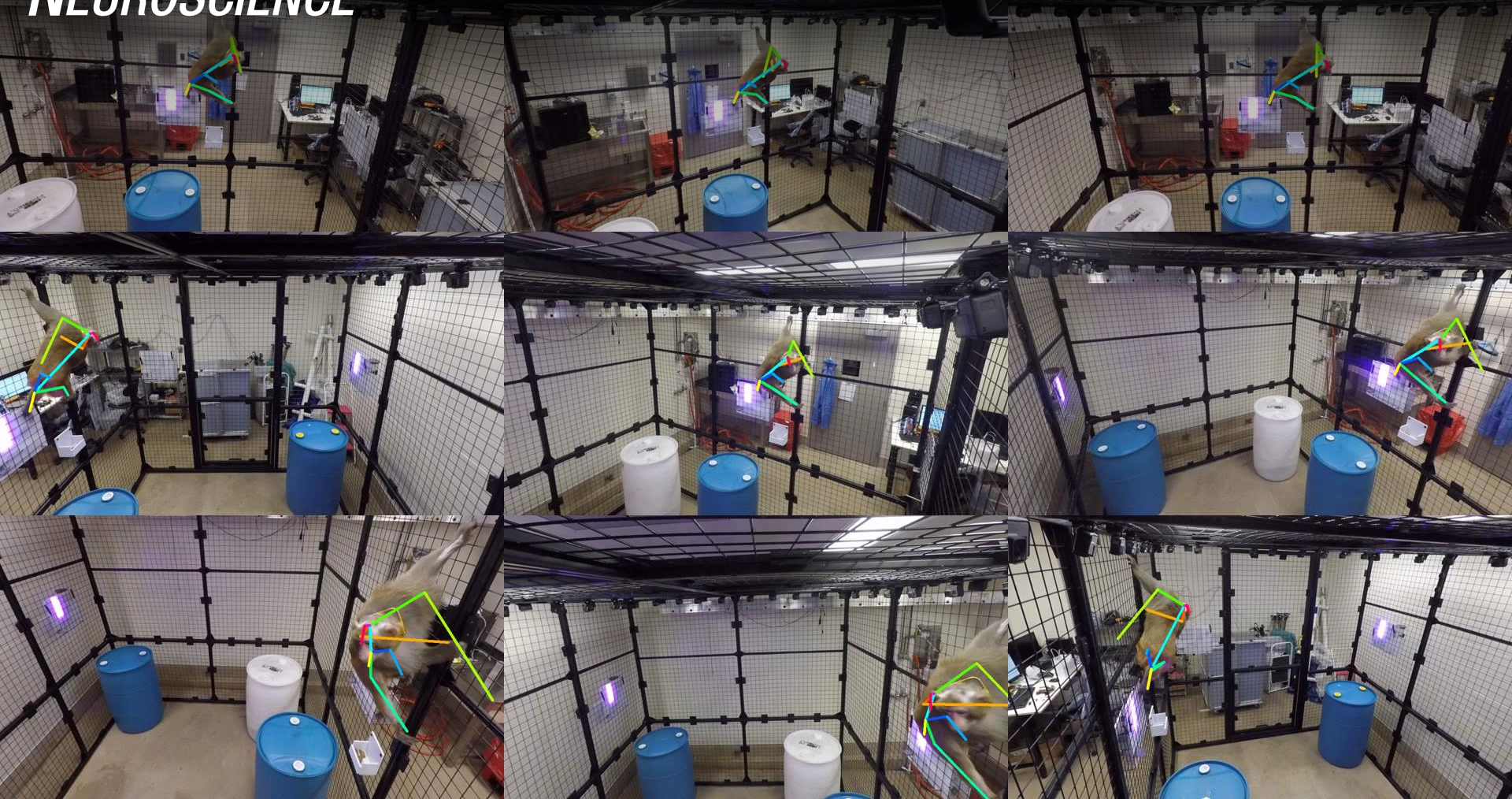
CLOTH DATA CAPTURE



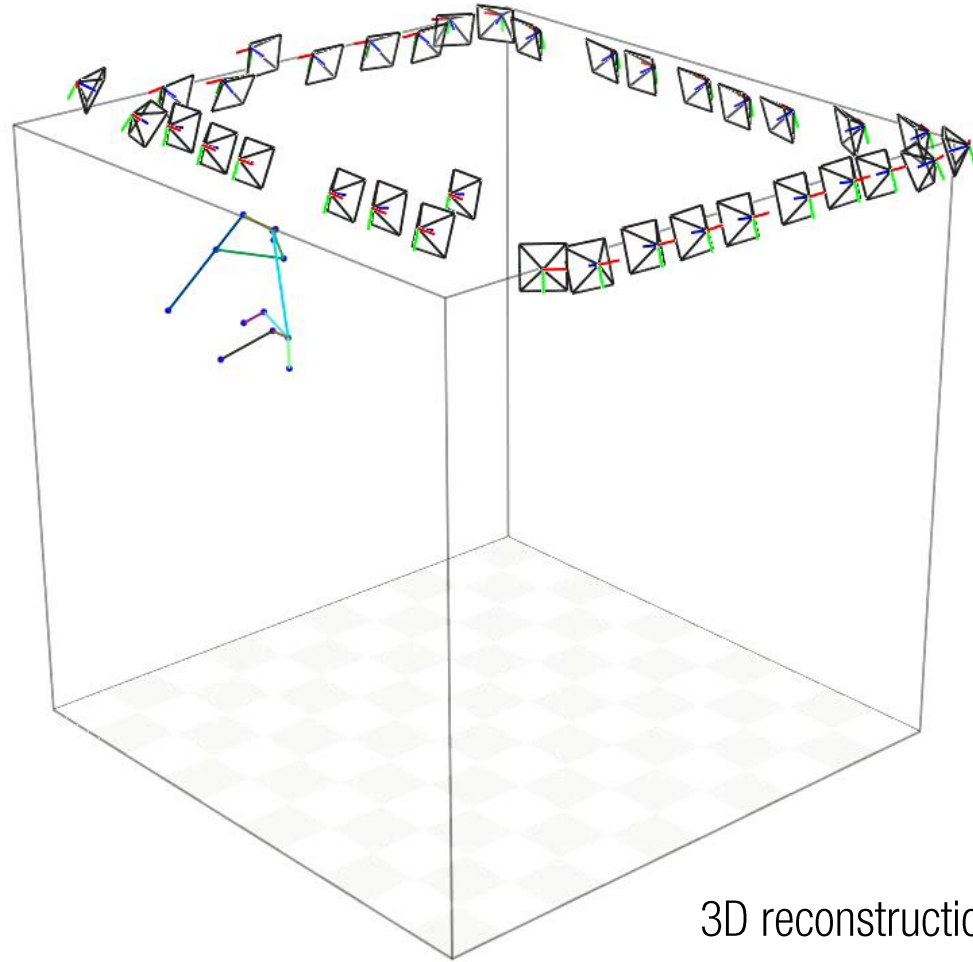
Top

Pants

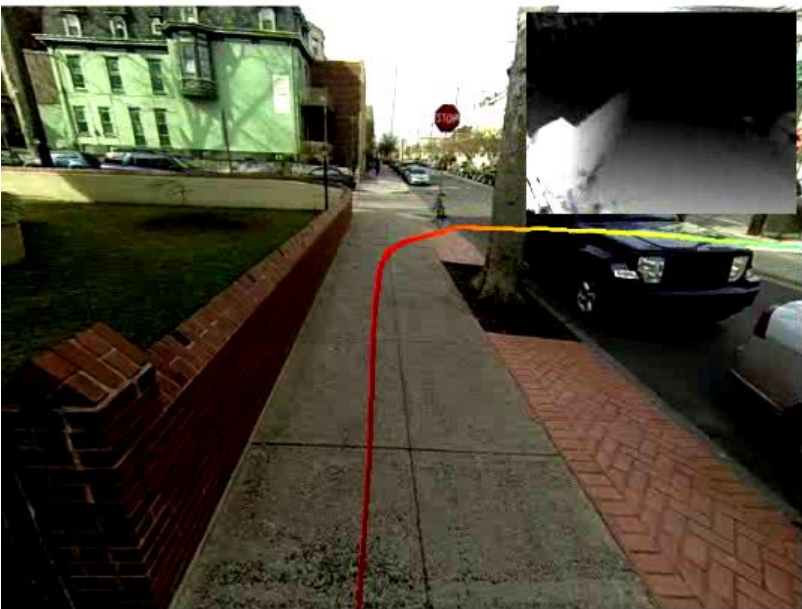
NEUROSCIENCE



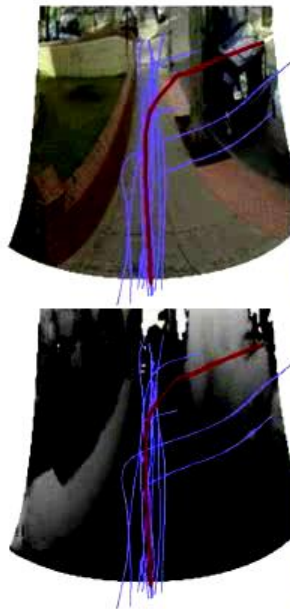
NEUROSCIENCE



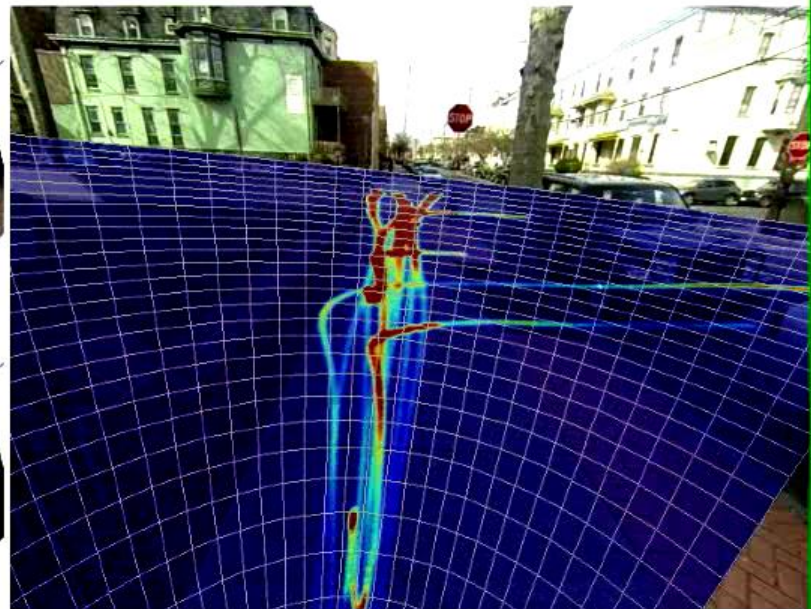
3D reconstruction of monkey movement



Ground truth



EgoRetinal map

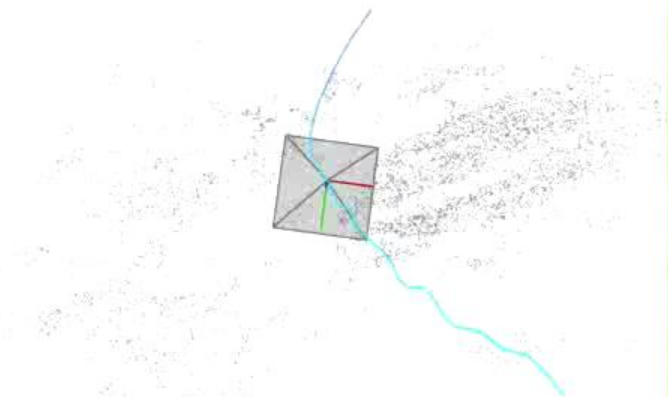


Predicted trajectories

SENSORIMOTOR SKILL LEARNING



<https://www.youtube.com/watch?v=aVJ45wIUE88>



3D reconstruction