

FACE DETECTION



Human face detection



Applications

- Automatic selection of camera settings
 - Personalized advertising campaigns
 - User Authentication
 - Law Enforcement
 - Healthcare
-

Human face detection

- Haar features for face detection
 - Integral image
 - Nearest Neighbour classifier
 - Support Vector Machine
-

Face detection process



Face detection framework

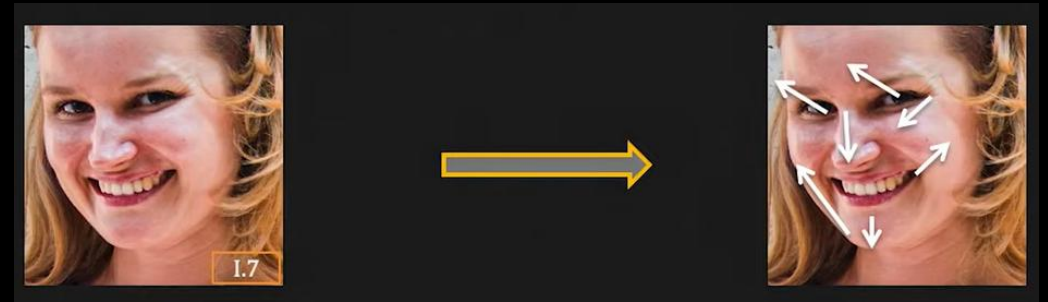
- For each window:



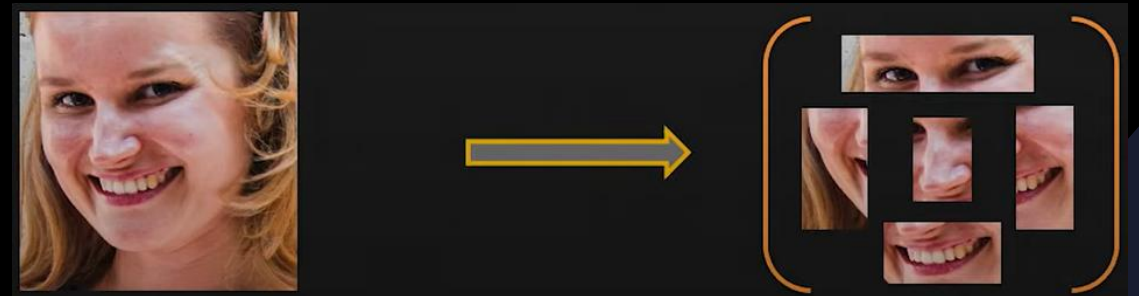
- Features?
 - Classifier?
-

What are Good Features?

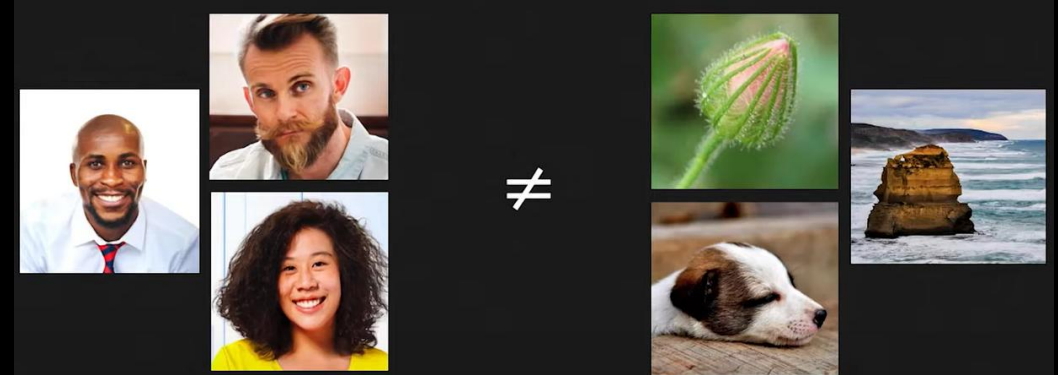
- Interest points (Edges, Corners, SIFT)?



- Facial Components (Templates)?



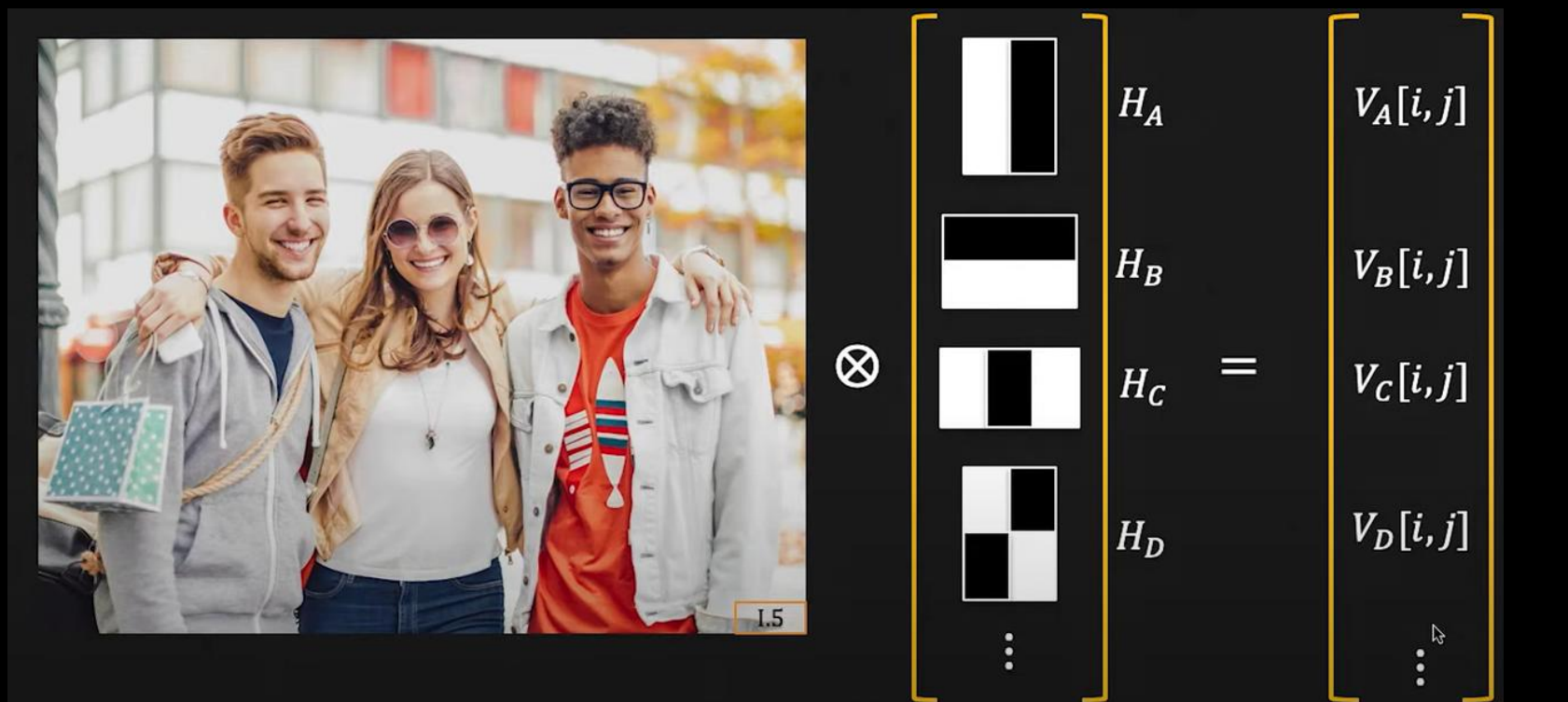
Characteristics of Good features



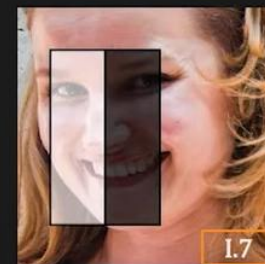
- Discriminate Face/Non-face

- Extremely fast to compute
-

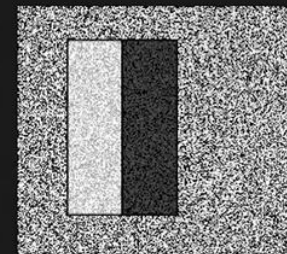
Haar features



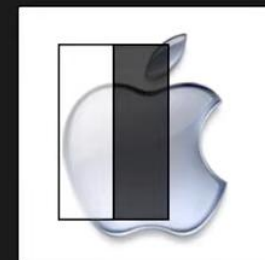
Discriminative ability of Haar features



$$V_A = 64$$



$$V_A \approx 0$$



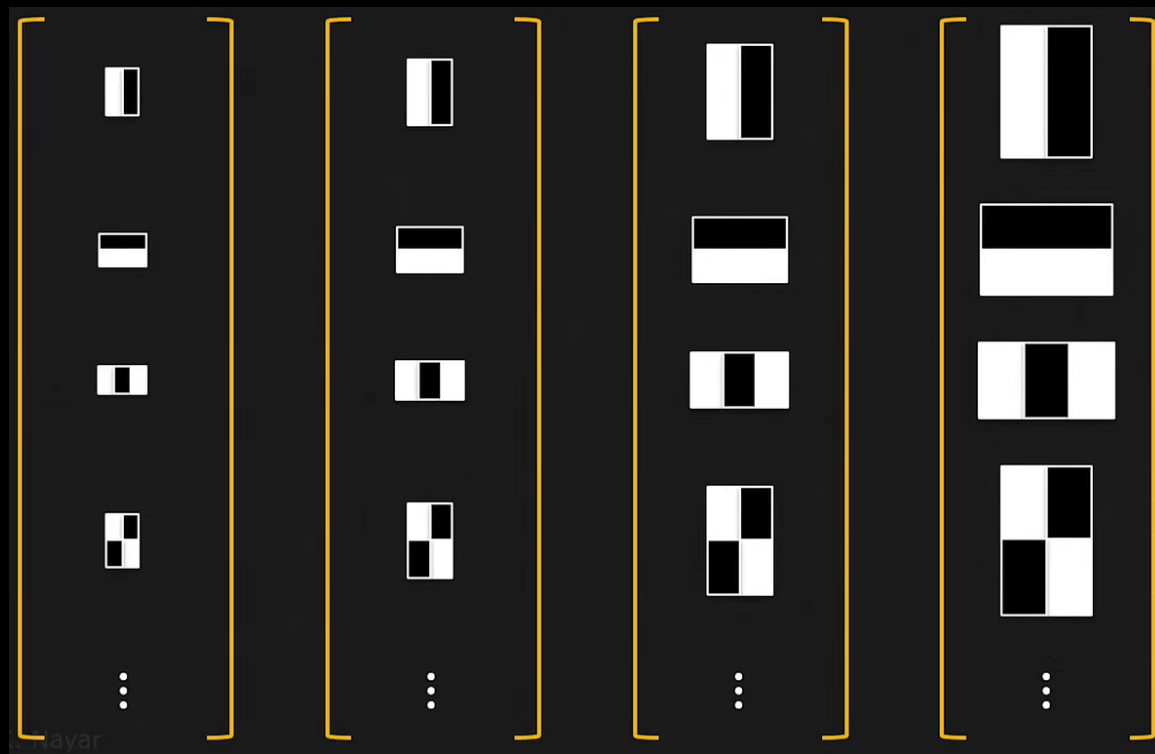
$$V_A = 16$$



$$V_A = -127$$

- Sensitive to Directionality of patterns

Detecting faces of different size



Computing Haar features



Response to Filter H_A at location (i, j) :

$$V_A[i, j] = \sum_m \sum_n I[m - i, n - j] H_A[m, n]$$

$$V_A[i, j] = \sum (\text{pixel intensities in white area}) \\ - \sum (\text{pixels intensities in black area})$$

Haar feature: Computation cost

- Value = $\Sigma(\text{pixel intensities in white}) - \Sigma(\text{pixels intensities in black})$
- Computation cost = $(N * M - 1)$ additions per pixel per filter per scale



Integral image

- A table that holds sum of all pixel values to the left and top of a given pixel including itself

98	110	121	125	122	129
99	110	120	116	116	129
97	109	124	111	123	134
98	112	132	108	123	133
97	113	147	108	125	142
95	111	168	122	130	137
96	104	172	130	126	130

Image *I*

98	208	329	454	576	705
197	417	658	899	1137	1395
294	623	988	1340	1701	2093
392	833	1330	1790	2274	2799
489	1043	1687	2255	2864	3531
584	1249	2061	2751	3490	4294
680	1449	2433	3253	4118	5052

Integral Image *II*

Summation within a Rectangle

$$\begin{aligned}\text{Sum} &= \Pi_P - \Pi_Q - \Pi_S + \Pi_R \\ &= 3490 - 1137 - 1249 + 417 \\ &= 1521\end{aligned}$$

Computation Cost: Only 3 additions

98	110	121	125	122	129
99	110	120	116	116	129
97	109	124	111	123	134
98	112	132	108	123	133
97	113	147	108	125	142
95	111	168	122	130	137
96	104	172	130	126	130

Image *I*

	98	208	329	454	576	705	
<i>R</i>	197	417	658	899	1137	1395	<i>Q</i>
	294	623	988	1340	1701	2093	
	392	833	1330	1790	2274	2799	
	489	1043	1687	2255	2864	3531	
<i>S</i>	584	1249	2061	2751	3490	4294	<i>P</i>
	680	1449	2433	3253	4118	5052	

Integral Image *II*

Haar response using Integral image

Value = $\Sigma(\text{pixel intensities in white}) - \Sigma(\text{pixels intensities in black})$

$$= (\Pi_O - \Pi_T + \Pi_R - \Pi_S) - (\Pi_P - \Pi_Q + \Pi_T - \Pi_O)$$

$$= (2061 - 329 + 98 - 584) - (3490 - 576 + 329 - 2061)$$

$$= 64$$

Computation cost: Only 7 additions

98	110	121	125	122	129
99	110	120	116	116	129
97	109	124	111	123	134
98	112	132	108	123	133
97	113	147	108	125	142
95	111	168	122	130	137
96	104	172	130	126	130

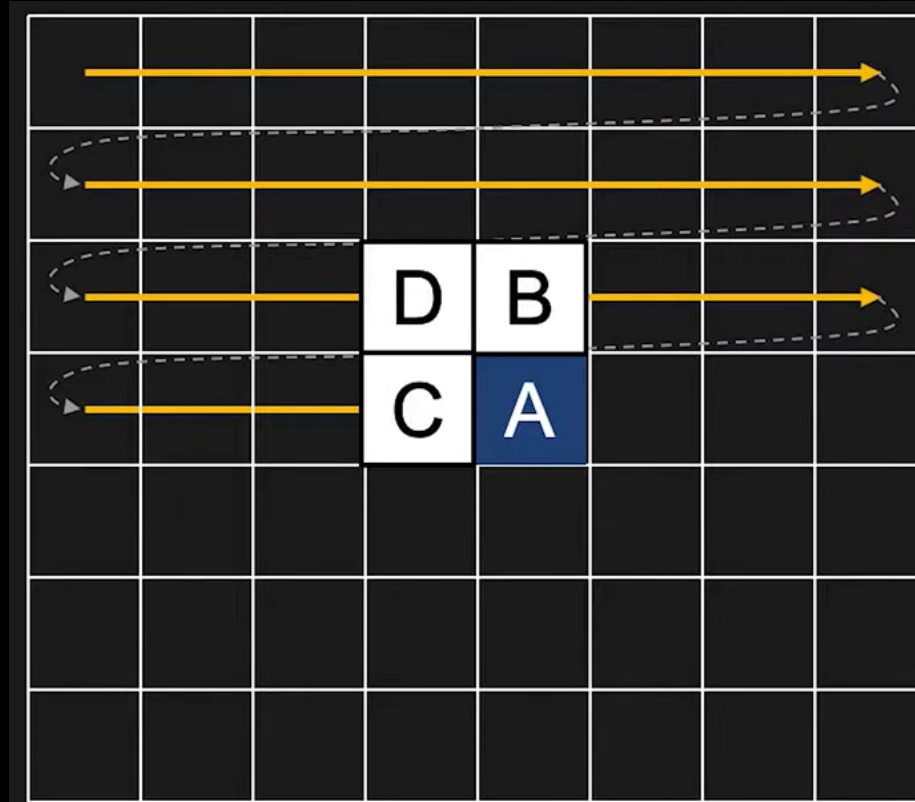
Image *I*

	<i>R</i>	98	208	329	454	576	705	<i>Q</i>
		197	417	658	899	1137	1395	
		294	623	988	1340	1701	2093	
		392	833	1330	1790	2274	2799	
		489	1043	1687	2255	2864	3531	
<i>S</i>		584	1249	2061	2751	3490	4294	<i>P</i>
<i>O</i>		680	1449	2433	3253	4118	5052	

Integral Image *II*

Computing Integral image

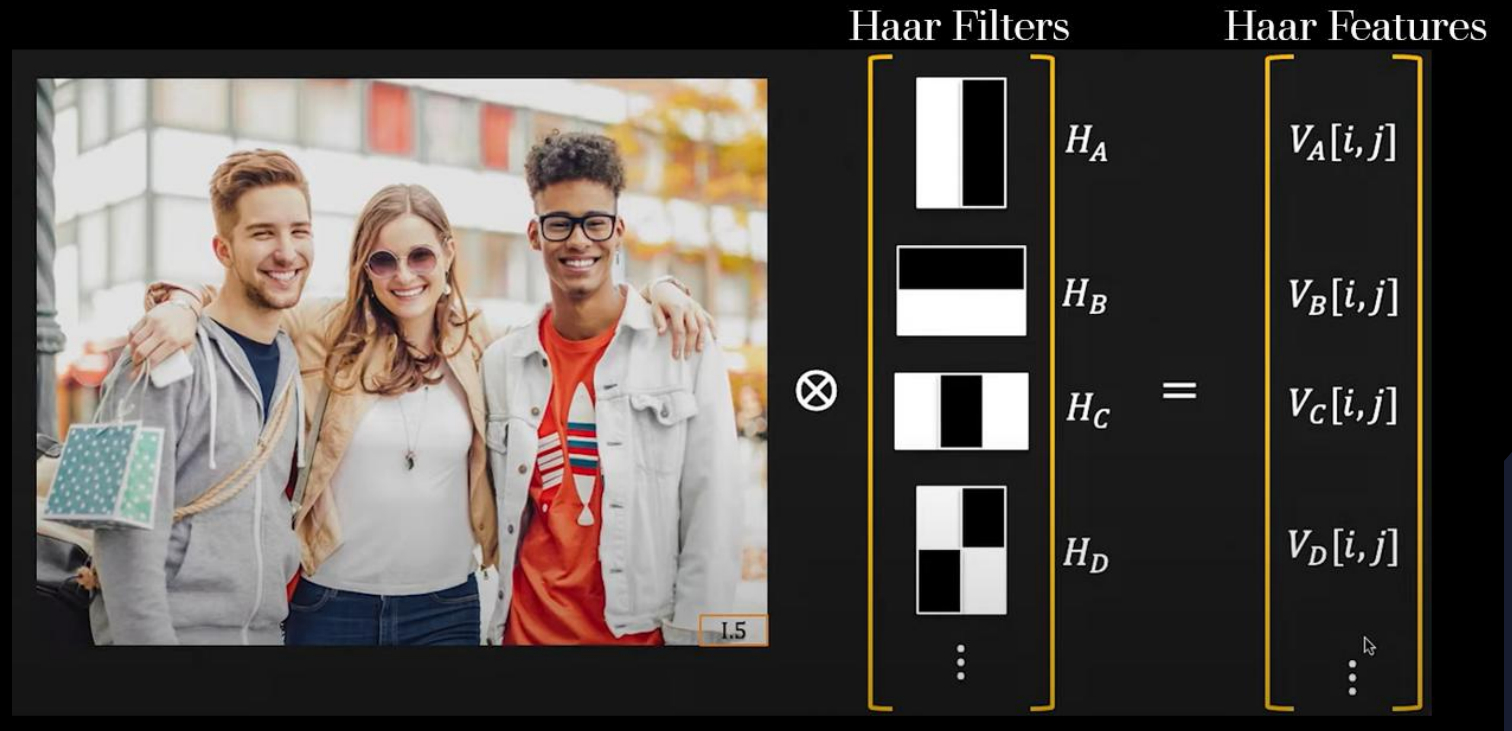
- $\Pi_A = \Pi_B + \Pi_C - \Pi_D + I_A$



Raster
Scanning

Haar features using Integral image

- Integral image needs to be computed once per test image
- Allows fast computations for Haar features



Programs

1. Design Haar filters of different scales
 2. Form Integral Image from test image
 3. Calculate Haar features using Integral image & Haar filters of different scales
-