# Descriptions Using Moments 

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## Moments

Family of stable binary (and grey level) shape descriptions

Can be made invariant to translation, rotation, scaling

Let $\left\{p_{r c}\right\}$ be the binary $(0,1)$ image pixels for row $r$ and col $c$ where 1 pixels are the object

## Moments II

Area $A=\sum_{r} \sum_{c} p_{r c}$
Center of mass
$(\hat{r}, \hat{c})=\left(\frac{1}{A} \sum_{r} \sum_{c} r p_{r c}, \frac{1}{A} \sum_{r} \sum_{c} c p_{r c}\right)$

A family of 'central' (translation invariant) moments (for any $u$ and $v$ ):

$$
m_{u v}=\sum_{r} \sum_{c}(r-\hat{r})^{u}(c-\hat{c})^{v} p_{r c}
$$

Subtracting center of mass makes it translation invariant

## Scale invariant moments

If double in dimensions, then moment $m_{u v}$ increases by $2^{u} 2^{v}$ for weightings and 4 for the number of pixels.
Similarly, area $A$ increases by 4 , and thus $A^{(u+v) / 2+1}$ increases by $4 \times 2^{u} 2^{v}$

So, the ratio:

$$
\mu_{u v}=\frac{m_{u v}}{A^{(u+v) / 2+1}}
$$

is invariant to scale.

## Rotation invariant moments

Moment invariant theory has identified methods to generate various orders of moments invariant to rotation.

6 functions $c i_{i}$ with rescaling applied to get into similar numerical ranges

Area $A=\sum_{r} \sum_{c} p_{r c}$
Center of mass $(\hat{r}, \hat{c})$

Define complex $u v$ central moment: $c_{u v}=\sum_{r} \sum_{c}((r-\hat{r})+i(c-\hat{c}))^{u}((r-\hat{r})-i(c-\hat{c}))^{v} p_{r c}$

## Scale invariance

Get specific scale invariant moments:

$$
\begin{aligned}
& s_{11}=c_{11} /\left(A^{2}\right) \\
& s_{20}=c_{20} /\left(A^{2}\right) \\
& s_{21}=c_{21} /\left(A^{2.5}\right) \\
& s_{12}=c_{12} /\left(A^{2.5}\right) \\
& s_{30}=c_{30} /\left(A^{2.5}\right)
\end{aligned}
$$

## Rotation invariant moments II

Rescaled (so values in similar range) rotation invariants:
$c i_{1}=\operatorname{real}\left(s_{11}\right)$
$c i_{2}=\operatorname{real}\left(1000 * s_{21} * s_{12}\right)$
$c i_{3}=10000 * \operatorname{real}\left(s_{20} * s_{12} * s_{12}\right)$
$c i_{4}=10000 * \operatorname{imag}\left(s_{20} * s_{12} * s_{12}\right)$
$c i_{5}=1000000 * \operatorname{real}\left(s_{30} * s_{12} * s_{12} * s_{12}\right)$
$c i_{6}=1000000 * \operatorname{imag}\left(s_{30} * s_{12} * s_{12} * s_{12}\right)$

## Scaled Moment matlab code

function vec $=$ getproperties (Image)
area $=$ bwarea(Image);
perim $=$ bwarea(bwperim(Image,4));
compactness $=$ perim*perim/(4*pi*area);
s11 = complexmoment (Image, 1,1) / (area^2);
s20 = complexmoment (Image, 2,0) / (area^2);

```
ci1 = real(s11);
ci2 = real(1000*s21*s12);
ci3 = 10000*real(s20*s12*s12);
```


## Example invariant property values

## y <br> 

| compactness | 1.93 | 1.81 | 1.90 |
| :---: | :---: | :---: | :---: |
| $c i_{1}$ | 0.23 | 0.27 | 0.25 |
| $c i_{2}$ | 0.18 | 0.37 | 0.45 |
| $c i_{3}$ | 0.08 | -0.50 | 0.11 |
| $c i_{4}$ | -0.00 | 0.37 | -0.64 |
| $c i_{5}$ | 0.23 | -0.47 | 0.09 |
| $c i_{6}$ | -0.00 | 0.07 | -0.63 |

## Feature Vector

Standard description for many visual processes: form a vector from set of descriptions:
$\vec{x}=\left(\text { compactness }, c i_{1}, c i_{2}, c i_{3}, c i_{4}, c i_{5}, c i_{6}\right)^{\prime}$
Multiple vectors if several structures or locations to describe

These vectors are then used in next processes, eg. recognition

## Lecture Overview

1. Moments: an infinite family of shape descriptions
2. A way to make them invariant to rotation, translation, and scale
