## 1D Projective Coordinates

The 1-D projective coordinate of a point $P$ :

$$
\begin{aligned}
& {[P]=\left[\begin{array}{ll}
{\left[P_{\infty} P_{0} P_{I} P\right]=\left[\begin{array}{ll}
\left.p_{\infty} p_{0} p_{I} p\right]=\frac{\left|p_{\infty} p_{I}\right|}{\left|p_{0} p_{I}\right|} \frac{\left|p_{0} p\right|}{\left|p_{\infty} p\right|} \\
P_{0}-\text { the origin } & {\left[P_{0}\right]=0} \\
P_{I}-\text { the unit point } & {\left[P_{I}\right]=1} \\
P_{\infty}-\text { the supporting point } & {\left[P_{\infty}\right]= \pm \infty}
\end{array}\right.} \\
\begin{array}{ll}
{[P] \text { is equal to Euclidean coordinate along } N} \\
{[p] \text { is its measurement in the image plane }}
\end{array}
\end{array}, n^{\prime}: N^{\prime} \| N\right.}
\end{aligned}
$$

## Applications

- Given the image of a line $N$, the origin, the unit point, and the vanishing point, then the Euclidean coordinate of any point $P \in N$ can be determined $\quad \rightarrow$ see Slide 45
- Finding v.p. of a line through a regular object
$\rightarrow$ see Slide 46


## Application: Counting Steps



- Namesti Miru underground station in Prague

detail around the vanishing point

Result: $[P]=214$ steps (correct answer is 216 steps)
4Mpx camera

## Application: Finding the Horizon from Repetitions


in 3D: $\left|P_{0} P\right|=2\left|P_{0} P_{I}\right|$ then $[\mathrm{H} \& Z$, p. 218] $\circledast \mathrm{P} 1 ; 1$ pt: How high is the camera above the floor?

$$
\left[P_{\infty} P_{0} P_{I} P\right]=\frac{\left|P_{0} P\right|}{\left|P_{0} P_{I}\right|}=2 \quad \Rightarrow \quad\left|p_{\infty} p_{0}\right|=\frac{\left|p_{0} p_{I}\right| \cdot\left|p_{0} p\right|}{\left|p_{0} p\right|-2\left|p_{0} p_{I}\right|}
$$

- could be applied to counting steps (Slide 45)


## Homework Problem

$\circledast \mathrm{H} 2 ; 3$ pt: What is the ratio of heights of Building $A$ to Building $B$ ?

- expected: conceptual solution
- deadline: +2 weeks


Hints

1. what are the properties of line $h$ connecting the top of Buiding $B$ with the point $m$ at which the horizon is intersected with the line $p$ joining the foots of both buildings? [1 point]
2. how do we actually get the horizon $n_{\infty}$ ? [ 1 point] (we do not see it directly, there are hills there)
3. what tool measures the length? [formula $=1$ point]

## 2D Projective Coordinates



Application: Measuring on the Floor (Wall, etc)


San Giovanni in Laterano, Rome

- measuring distances on the floor in terms of tile units
- what are the dimensions of the seal? Is it circular (assuming square tiles)?
- needs no explicit camera calibration
because we see the calibrating object (vanishing points)


## Real Camera with Radial Distortion


image with no radial distortion

an extreme case of radial distortion

image undistorted by division model
distortion types

none $(\lambda=0)$

barrel $(\lambda=0.3)$

pincushion $(\lambda=-0.3)$

## - The Radial Distortion Mapping


$y_{0}$ - center of radial distortion (usually principal point)
$y_{L}$ - linearly projected point
$y_{R}$ - radially distorted point

- radial distortion $r$ maps $y_{L}$ to $y_{R}$ along the radial direction
- magnitude of the transfer depends on the radius $\left\|y_{L}-y_{0}\right\|$ only

- circles centered at $y_{0}$ map to centered circles, lines incident on $y_{0}$ map on themselves
- the mapping $r()$ can be scaled to $\operatorname{ar}()$ so that a particular circle $C_{n}$ does not scale

| distortion | inside $C_{n}$ | outside $C_{n}$ |
| ---: | :---: | :---: |
| barrel | expanding <br> contracting | contracting <br> expanding |


in barrel


- choose boundary point that preserves all image content within the same image size


## Radial Distortion Models



- let $\mathbf{z}=\mathbf{y}-\mathbf{y}_{0}$
non-homogeneous
- we have $\mathbf{z}_{R}=r\left(\mathbf{z}_{L}\right) \quad \mathbf{z}_{L}$ - linear, $\mathbf{z}_{R}$ - distorted
- but are often interested in $\mathbf{z}_{L}=r^{-1}\left(\mathbf{z}_{R}\right)$
- $\mathbf{y}_{n}$ - a no-distortion point on $C_{n}: r\left(\mathbf{y}_{n}\right)=\mathbf{y}_{n}$
- $\mathbf{z}_{n}=\mathbf{y}_{n}-\mathbf{y}_{0}$

Division Model single parameter $-1 \leq \lambda<1$, has an analytic inverse, models even some fish-eye lenses

$$
\mathbf{z}_{R}=\frac{\hat{\mathbf{z}}}{1+\sqrt{1+\lambda \frac{\|\hat{\mathbf{z}}\|^{2}}{\left\|\mathbf{z}_{n}\right\|^{2}}}}, \quad \text { where } \hat{\mathbf{z}}=\frac{2 \mathbf{z}_{L}}{1-\lambda} \quad \text { and } \quad \mathbf{z}_{L}=\frac{1-\lambda}{1-\lambda \frac{\left\|\mathbf{z}_{R}\right\|^{2}}{\left\|\mathbf{z}_{n}\right\|^{2}}} \mathbf{z}_{R}
$$

$\lambda>0$ - barrel distortion, $\lambda<0$ - pincushion distortion
Polynomial Model better fit for $n \geq 3$, no analytic inverse, may loose monotonicity, hard to calibrate

$$
\mathbf{z}_{L}=\frac{D\left(\mathbf{z}_{R} ; \mathbf{z}_{n}, \mathbf{k}\right)}{1+\sum_{i=1}^{n} k_{i}} \mathbf{z}_{R}, \quad D\left(\mathbf{z}_{R} ; \mathbf{z}_{n}, \mathbf{k}\right)=1+k_{1} \rho^{2}+k_{2} \rho^{4}+\cdots+k_{n} \rho^{2 n}, \rho=\frac{\left\|\mathbf{z}_{R}\right\|}{\left\|\mathbf{z}_{n}\right\|}, \mathbf{k}=\left(k_{i}\right)
$$

e.g. $k_{i} \geq 0$ - barrel distortion, $k_{i} \leq 0-$ pincusion distortion, $i=1, \ldots, n$

Zernike polynomials $R_{i}^{0}$ are a better choice: $R_{2}^{0}(\rho)=2 \rho^{2}-1, R_{4}^{0}(\rho)=6 \rho^{4}-6 \rho^{2}+1, R_{6}^{0}(\rho)=\cdots$

## - Real and Linear Camera Models



$$
\mathbf{K}_{0}=\left[\begin{array}{ccc}
f & 0 & 0 \\
0 & f & 0 \\
0 & 0 & 1
\end{array}\right] \quad \text { 'ideal' calibration matrix } \quad \mathbf{A} \mathbf{K}_{0}=\left[\begin{array}{ccc}
f & s f & u_{0} \\
0 & a f & v_{0} \\
0 & 0 & 1
\end{array}\right]
$$

$$
\mathbf{A}=\left[\begin{array}{llc}
1 & s & u_{0} \\
0 & a & v_{0} \\
0 & 0 & 1
\end{array}\right]
$$

## Notes

- assumption: the principal point and the center of radial distortion coincide
- $f$ included in $\mathbf{K}_{0}$ to make radial distortion independent of focal length
- A makes radial lens distortion an elliptic image distortion
- it suffices in practice that $r^{-1}$ is an analytic function ( $r$ need not be)


## Calibrating Radial Distortion

- radial distortion calibration includes at least 5 parameters: $\lambda, u_{0}, v_{0}, s, a$

1. detect a set of straight line segment images $\left\{s_{i}\right\}_{i=1}^{n}$ from a calibration target
2. select a suitable set of $k$ measurement points per segment
how to select $k$ ?
3. define invariant radial transfer error per measurement point $e_{i, j}$
and per segment $e_{i}^{2}=\sum_{j=1}^{k-2} e_{i, j}^{2}$
invariant to rotation, translation

4. minimize total radial transfer error: $\quad \arg \min _{\lambda, u_{0}, v_{0}, s, a} \sum_{i=1}^{n} e_{i}^{2}$

- line segments from real-world images requires segmentation to inliers/outliers
inliers $=$ lines that are straight in reality
- marginalisation over the hidden label gives a 'robust' error, e.g.

$$
\varepsilon_{i}^{2}=-\log \left(e^{-\frac{e_{i}^{2}}{2 \sigma^{2}}}+t\right), \quad t>0
$$

- direct optimization usually suffices but in general such optimization is unstable


## Example Calibrations

Low-resolution (VGA) wide field-of-view ( $130^{\circ}$ ) camera
Camera 0, im. 6: Reprojection errors (16x)



| Cam | 0 |
| ---: | :--- |
| RMS $[\mathrm{px}]$ | 0.33 |
| $\mathrm{max}[\mathrm{px}]$ | 1.97 |
| $f[\mathrm{px}]$ | 94.59 |
| $a[-]$ | 1.0951 |
| $u_{0}[\mathrm{px}]$ | 243.26 |
| $v_{0}[\mathrm{px}]$ | 353.37 |
| $(\mathrm{poly}) k_{1}$ | 0.8256 |
| $k_{2}$ | -0.2261 |
| $k_{3}$ | 1.2524 |



## 4 Mpix consumer camera



- radial distortion is slightly dependend on focal length

Thank You




Camera 0, im. 6: Reprojection errors (16x)



Calibration errors


Radial distortion coefficient values


