EECS 4422/5323 Computer Vision Stereopsis 2

Calden Wloka

6 November, 2019

Calden Wloka (York University)

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Announcements

- More site visits today
- Assignment 2 data posted Monday afternoon, updates to text as recently as Tuesday
- Reminder: Drop date is this Friday, so review your marks

White Paper (2%) + Proposal (8%) + Site Visit (5%) + Assignment 1 (15%) = 30% total grade

A Note About Grayscale

Gray is a range of colours which, in the RGB colour space, have the property that R = G = B.

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A grayscale pixel value can therefore be compactly represented by only a single value, or it can be redundantly represented by three channels. The way in which it is represented is a matter of convention and software standards, and is rather hard (at least for me) to remember and predict.

Outline

- Academic Publishing
- Correspondence Problem
- Constraints and Strategies
 - Coarse-to-fine processing
 - Epipolar geometry

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 - Many industrial research positions still encourage employees to publish
 - Having publications on your CV can boost your appeal for a more research-oriented position

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 - A codebase which could be made public

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NOTE: I must have read and agreed to the submission of anything which has my name on it as a co-author.

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Correspondence in Stereo Images

Given two (or more) images, we need to find correspondence between image pixels in order to compute the three dimensional structure of the scene.





Left Image

Right Image

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Two common approaches include: keypoint based, area based.

Keypoint Matching

As discussed previously in the course, keypoints can be highly discriminative and will often provide a strong set of correspondence points between images.

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As discussed previously in the course, keypoints can be highly discriminative and will often provide a strong set of correspondence points between images.

However, this correspondence is often sparse, and may therefore not provide a sufficiently dense depth map of a scene.

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Area Matching

• Divide the images into overlapping patches (typically of fixed size)

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- We need to pick a similarity measure to quantify degree of patch matching

Area Similarity Measure

Cross-Correlation

- Simple to compute
- Requires normalization of patch values

Sum of squared difference

- No need to normalize
- Slightly more computationally expensive than cross-correlation

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As with most problems in computer vision, the number of operations required grows rapidly with image resolution and patch size or number of keypoints found.

One potential solution is to approximately solve the problem at a low resolution (whether reducing image resolution or skipping intervening steps), then iteratively refine the solution as one moves back toward full resolution.

Coarse-to-fine Example

Say we are attempting to match a 20×20 patch within a 200×200 image. This requires $(180)(180)(20^2) = 12960000$ pixel-wise operations.

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Of course, this low resolution match hasn't fully solved our problem, we've just found the neighbourhood where the proper match should be. But refining that match at high resolution only requires searching over sixteen different possible placements of our patch, rather than the entire image.

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Epipolar Diagram

The diagram below shows two image views with the pin-hole assumption and the virtual image plane shown in blue.

When the origin of the left and right image are connected, the points where this line intersects the image plane are the *epipoles* (or *epipolar points*).





Epipolar Geometry

Epipolar Diagram

For a point \mathbf{X} which lies directly on the optical axis of the left image, it will always land on the same location within the left image regardless of distance. Depending on the distance, however, it will land at a different location in the right image along a line running through the right epipole.



Image source: Wikipedia

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Image source: Wikipedia

This effectively reduces the search for correspondence down to a 1D search along the epipolar line.