

# CS664 Lecture #19: Layers, RANSAC, panoramas, epipolar geometry

Some material taken from:

- David Lowe, UBC

- Jiri Matas, CMP Prague

[http://cmp.felk.cvut.cz/~matas/papers/presentations/matas\\_beyond-ransac\\_cvprac05.ppt](http://cmp.felk.cvut.cz/~matas/papers/presentations/matas_beyond-ransac_cvprac05.ppt)

# Announcements

- Paper report due on 11/15
- Please choose a final project soon
  - Email me a proposal after you get your paper report graded
  - Which will be soon after 11/15!
- Project must have a research component
  - Talk to me if you have questions
- Next quiz Thursday 11/3
  - coverage through last lecture
- PS#2 due November 8



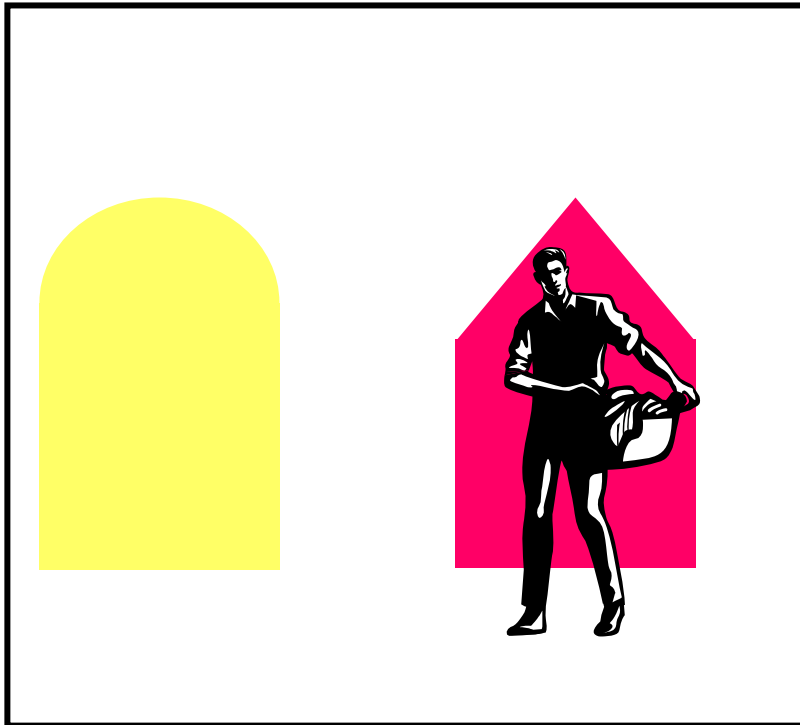
# Handling large motions

- None of these optical-flow based techniques work well for large motions or for really textured scenes
  - Need “just right” amount of texture!
- A standard solution for larger motions is to do this “coarse to fine”
  - Run on a low resolution version of the image
  - Apply this as a warp, then increase resolution
  - These methods have some ugly properties
    - But a number of people think they work



# Layered motion estimation

- Suppose there are multiple motions
  - Think of “Bugs Bunny” style animation



# Layered motion algorithms

- Global affine fit with IRLS should give us the dominant motion
  - Assuming it's  $>50\%$  of the image
  - Outlier pixels (low IRLS weights) are doing something else, so we can focus on them
- Need to find what the motions are, which pixels belong to each region
  - If we know one, we could compute the other
  - Classical application of EM
  - To initialize, compute local affine fits and cluster in 6-dimensional space

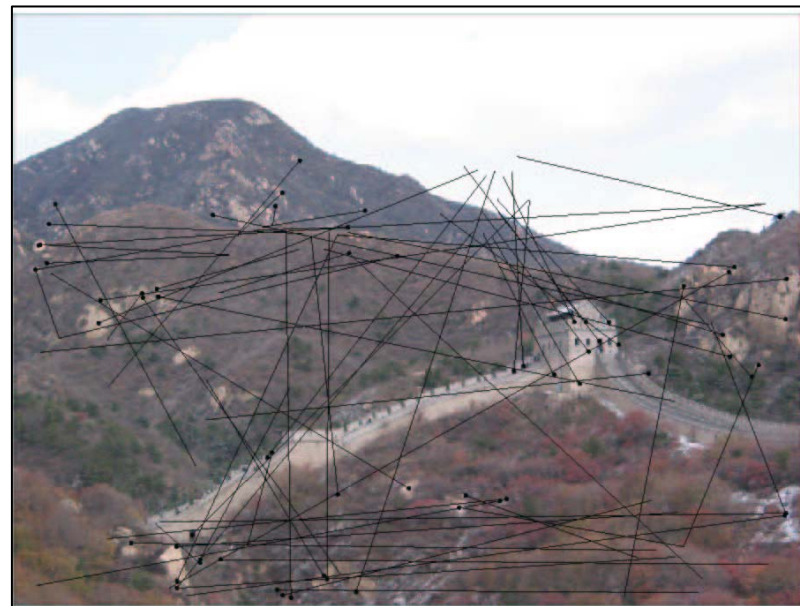


# RANSAC

- Extremely popular way to do model fitting in the presence of noisy data
  - One of the best algorithms in the vision toolkit
- Algorithm:
  - Select a random sample of data points
  - Find model that best fits these points (LS)
  - Find all other data points that like this model
    - Consensus set
- Parameters: number of iterations, sample size, consensus set “tolerance”



# Example: registration



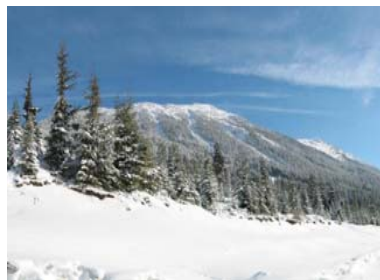
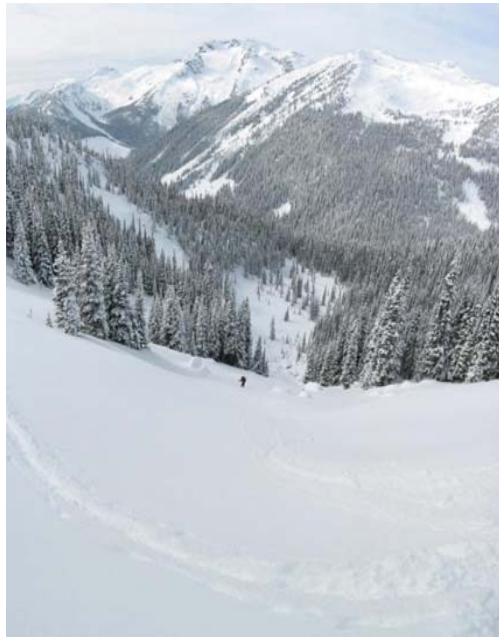
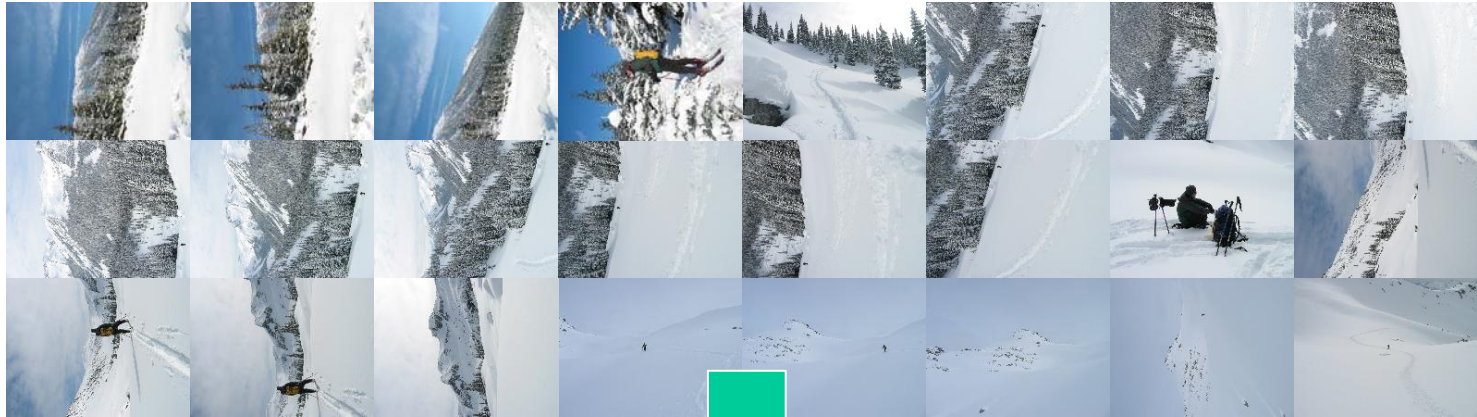
# Example: multiple motions



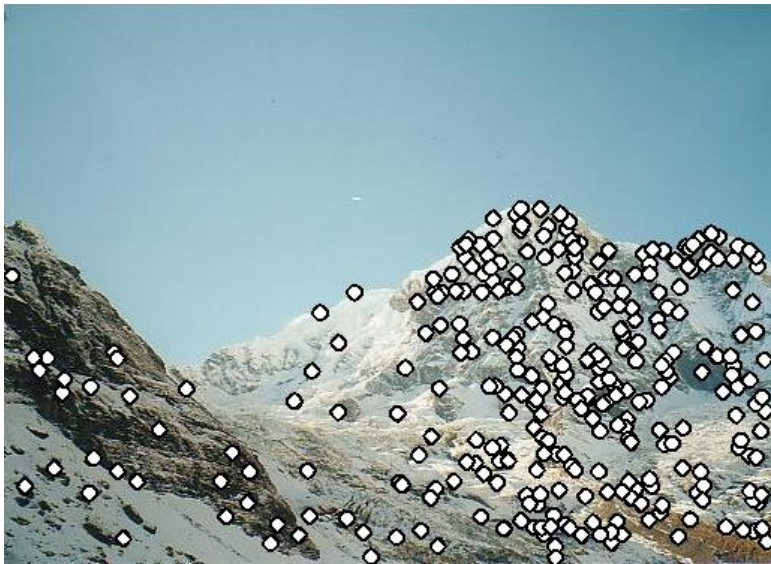
# RANSAC for sparse registration

- Given an interest-point operator
  - Corner detector, or SIFT (we will cover this)
- Assume we're looking at a plane
  - Planar homography
    - Homography = projective transformation
    - Planar homography = 2D affine homography
  - Application: recognizing panoramas
    - Brown & Lowe, ICCV 2003
    - <http://www.cs.ubc.ca/~mbrown/panorama>

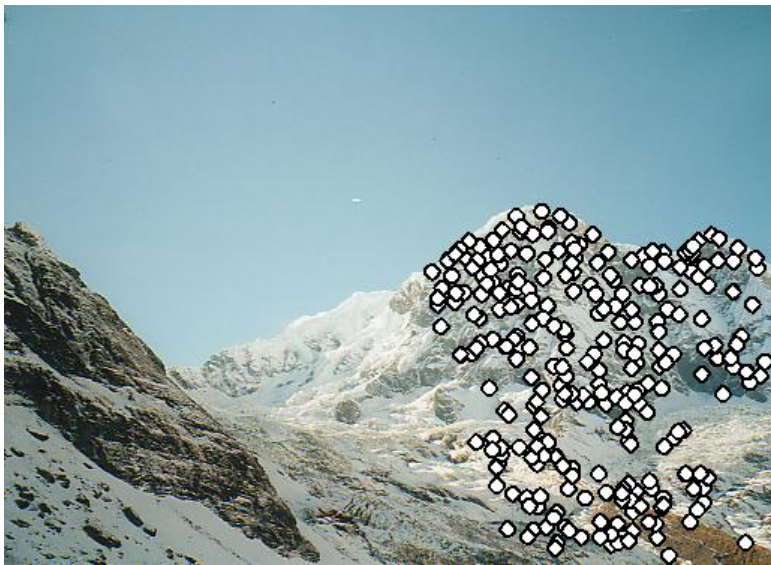
# Recognizing panoramas



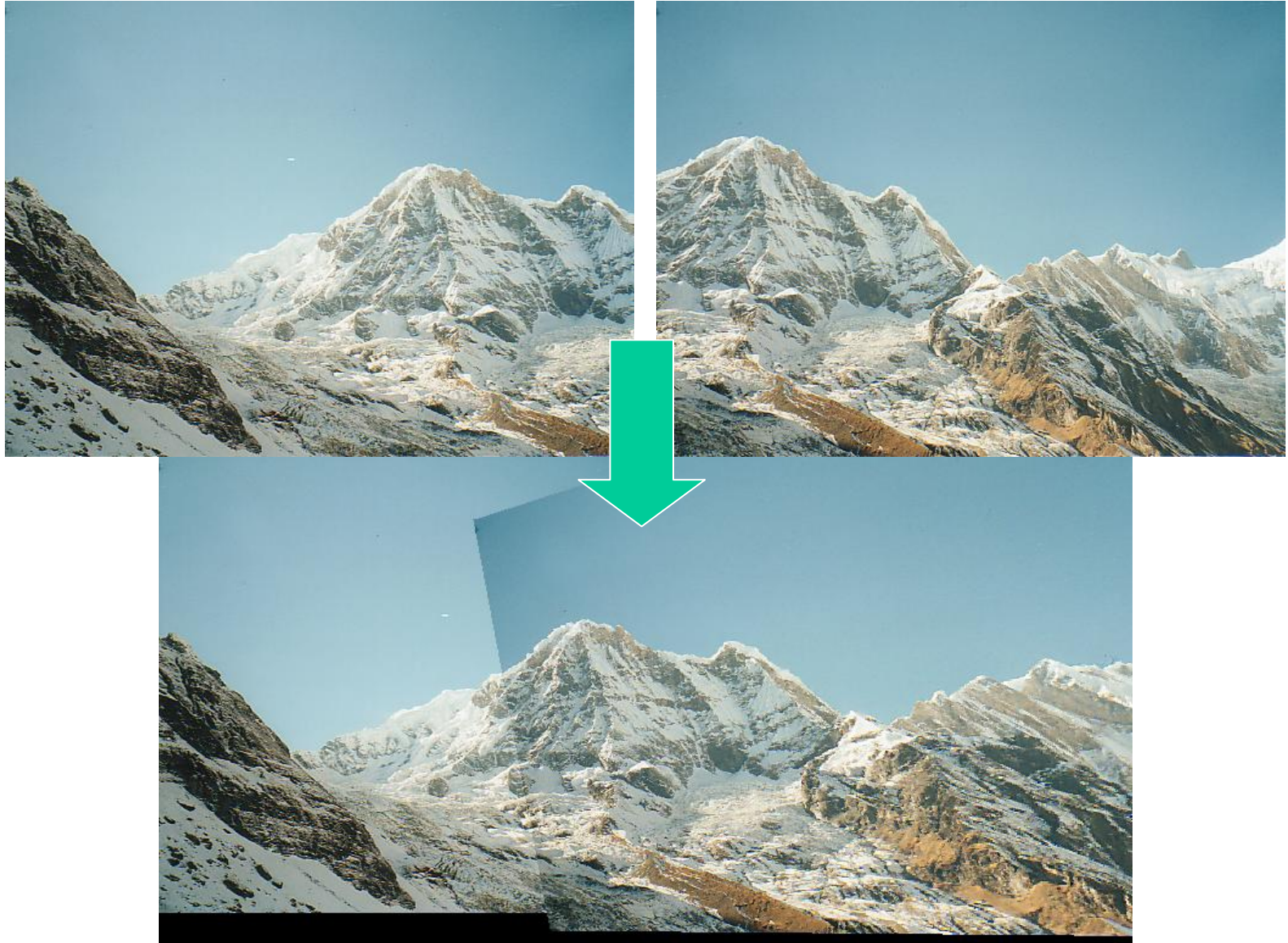
# Feature extraction (SIFT)



# Consensus set



# Panorama



# Completing the panorama

- We have a lot of pairwise panoramas
  - How do we create a complete panorama?
  - A connected set should be a panorama
- How to create the image?
  - Pairwise registrations aren't globally consistent
- Camera parameters come in two classes
  - Intrinsic: focal length, pixel size & spacing
  - External: rigid body motion (6 d.o.f.)
  - For a given panorama, we will assume the parameters are only rotation & focal length



# Bundle adjustment

- We have a set of cameras with their parameters  $\theta_{\text{old}}$ , and need to add a new image and estimate its parameters  $\theta$ 
  - Find the  $\theta$  that makes the feature points line up as closely as possible
    - Minimize the “reprojection error”
    - Robustify this, to handle outliers
  - Actually, we minimize both  $\theta_{\text{old}}$  and  $\theta$
- Non-linear least squares problem
  - Usually solved with Levenberg-Marquadt



# Bundle adjustment in action



# Results



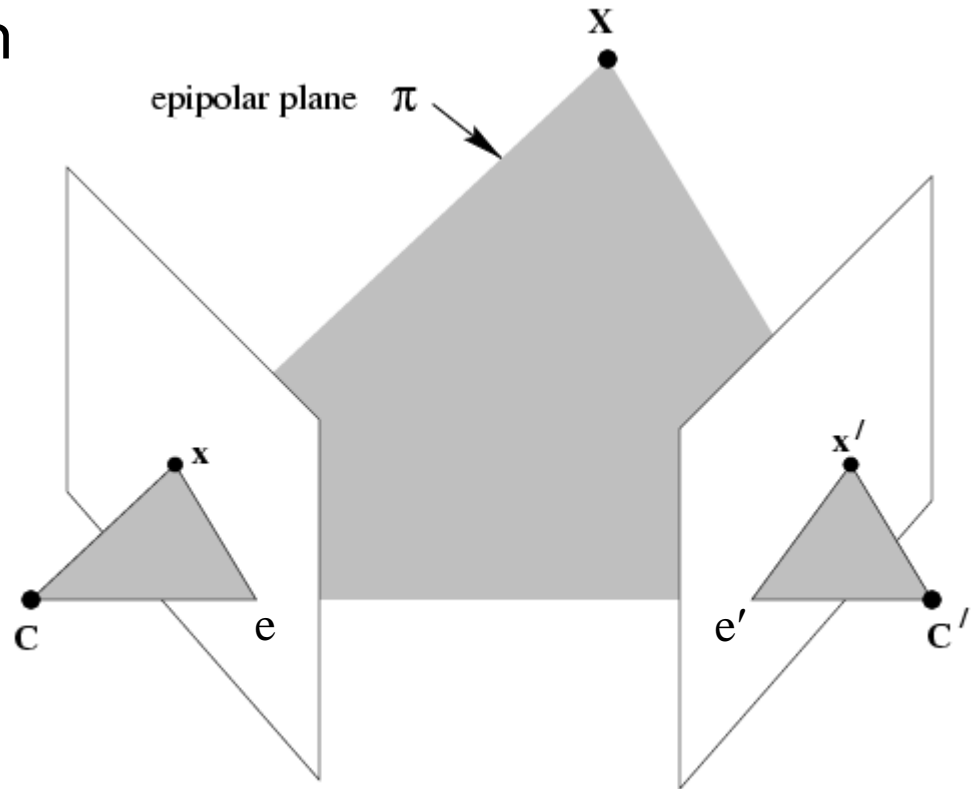
# Epipolar geometry

- Where could a point in  $I_1$  appear in  $I_2$ ?
  - Motion: anywhere nearby
  - Stereo: anywhere horizontally nearby
    - Why just horizontal?
  - Assume a stationary scene



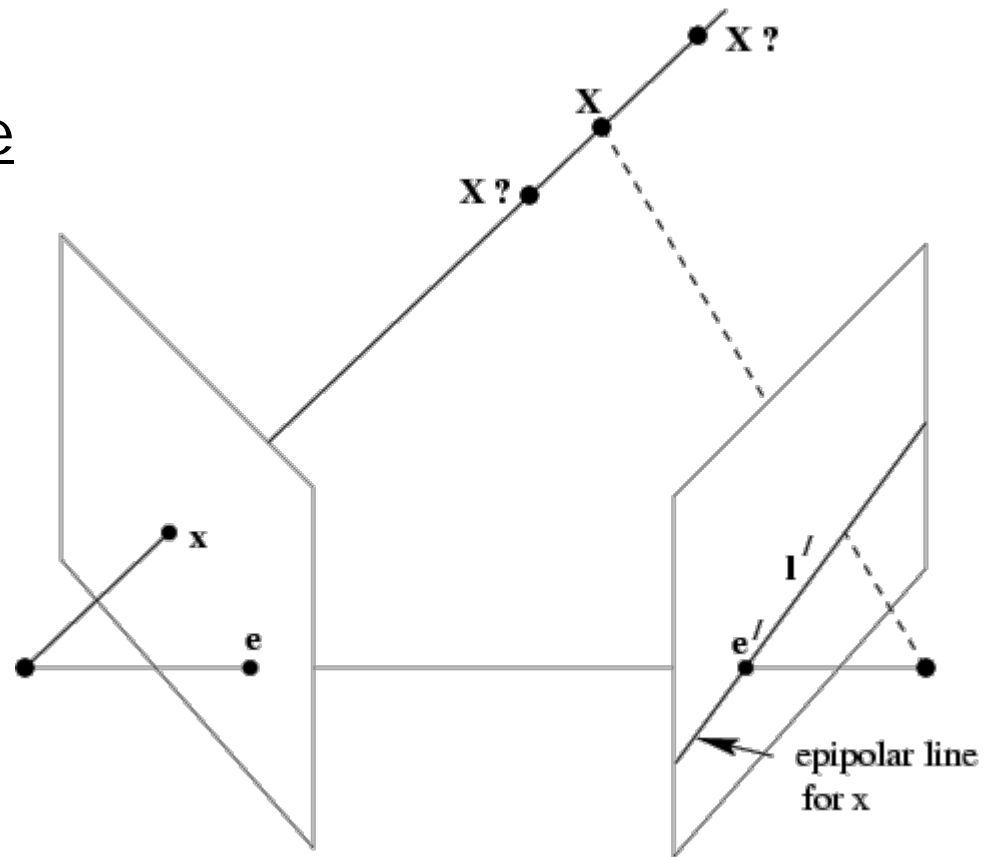
# Two View Geometry

- Point  $X$  in world and two camera centers  $C, C'$  define the epipolar plane
  - Images  $x, x'$  of  $X$  in two image planes lie on this plane
  - Intersection of line  $CC'$  with image planes define special points called epipoles,  $e, e'$



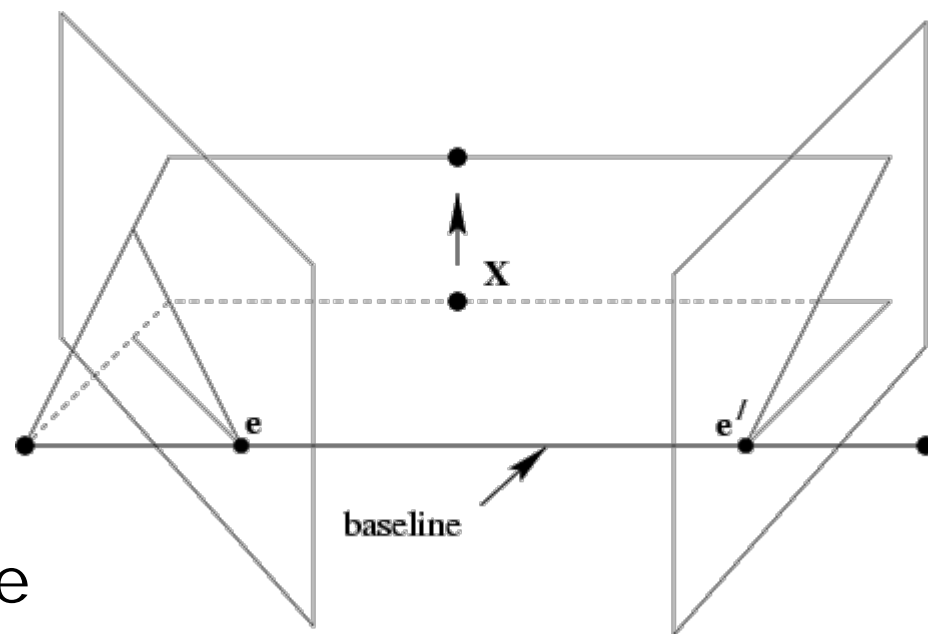
# Epipolar Lines

- Set of points that project to  $x$  in  $I$  define line  $l'$  in  $I'$ 
  - Called epipolar line
  - Goes through epipole  $e'$
  - A point  $x$  in  $I$  thus maps to a point on  $l'$  in  $I'$ 
    - Rather than to a point anywhere in  $I'$



# Epipolar Geometry

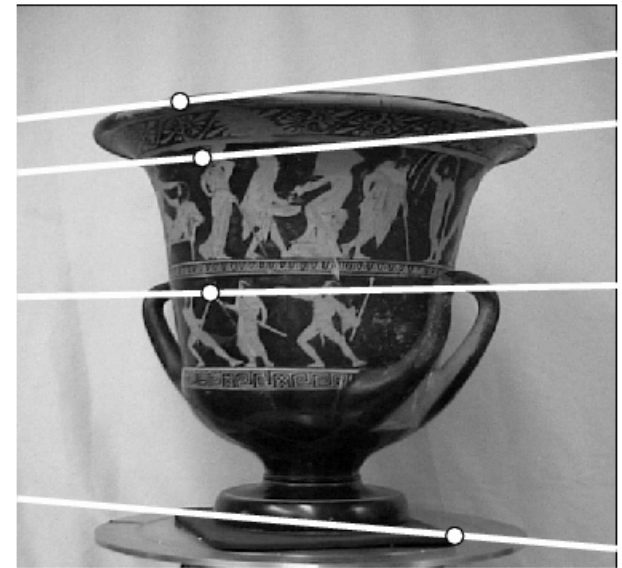
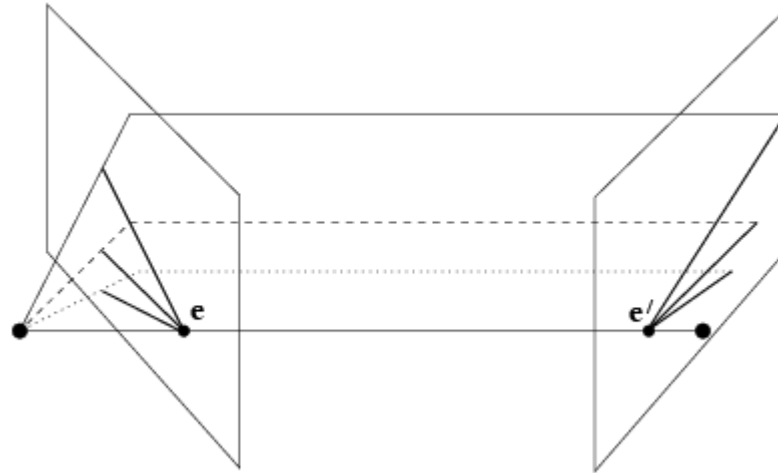
- Two-camera system defines one parameter family (pencil) of planes through baseline  $CC'$ 
  - Each such plane defines matching epipolar lines in two image planes
  - One parameter family of lines through each epipole
  - Correspondence between images



# Converging Stereo Cameras

Corresponding points lie on corresponding epipolar lines

Known camera geometry so 1D not 2D search!



# Epipoles in direction of motion

