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COLLEGE ON NEUROPHYSICS:
"DEVELOPMENT AND ORGANIZATION OF THE BRAIN"
7 November - 2 December 1988

"Visual Reconstruction: Stereo Vision"

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David Marr's 3 levels of information processing in the brain .

1. Computational theory
 2. Algorithm
 3. Hardware implementation (silicon!)
- At these levels there can be fruitful cooperation between Robot engineering and studies of biological vision.

Describing Curves

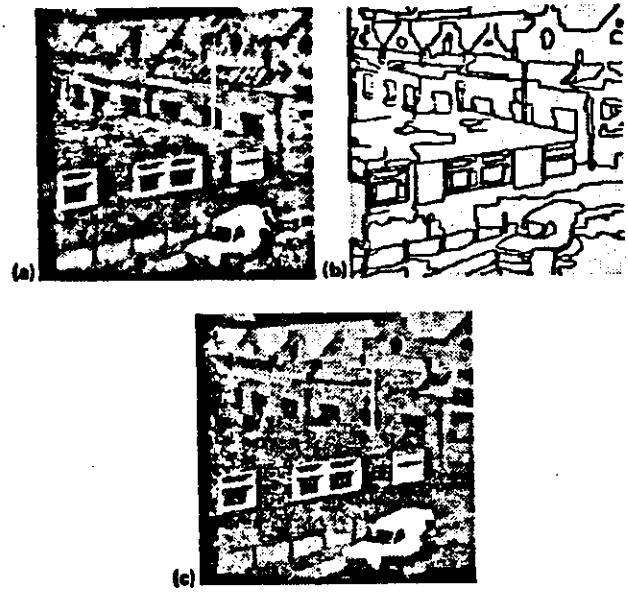
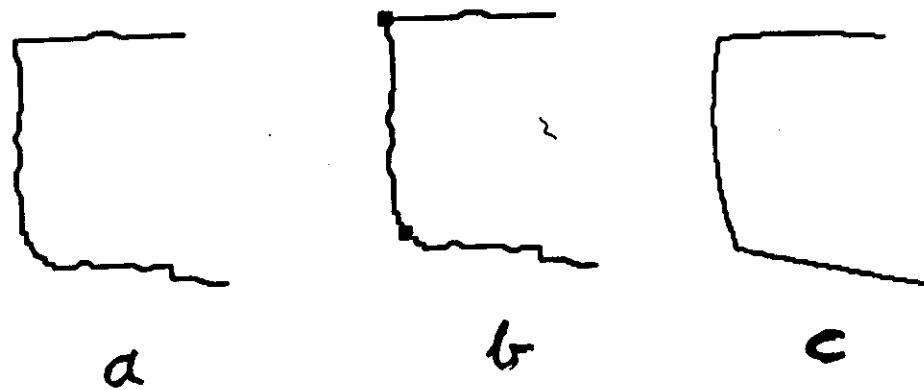


Figure 2.4: The weak membrane as an edge detector. The image in (a) and its discontinuities (b). Reconstructed intensity (c) is the filtered version of (a), preserving the discontinuities marked in (b). Both (b) and (c) are produced simultaneously by the weak membrane.

Edges + reconstruction simultaneously



- The curve
- Find discontinuities
- Approximate curve by straight lines and circular arcs.

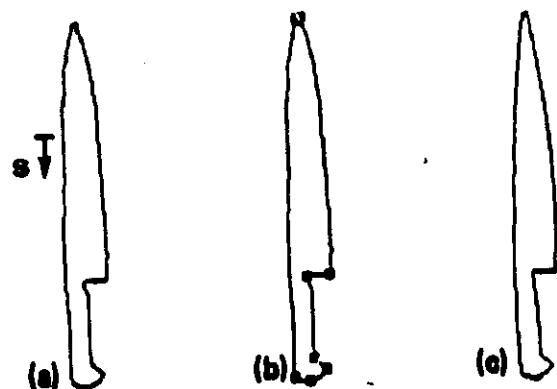


Figure 2.15: Weak string scale-space applied to a real image. Silhouette (a) segmented at coarse scale (b) and reconstructed by fitting arcs between discontinuities (c). It is apparent that discontinuities and arcs together constitute a compact but accurate representation of the silhouette. (d) Scale-space. Most features, in this case, are visible at both coarse and fine scale, except for the curved base of the handle, visible at coarse scale only. (Data after Asada and Brady (1986).)

Localisation!

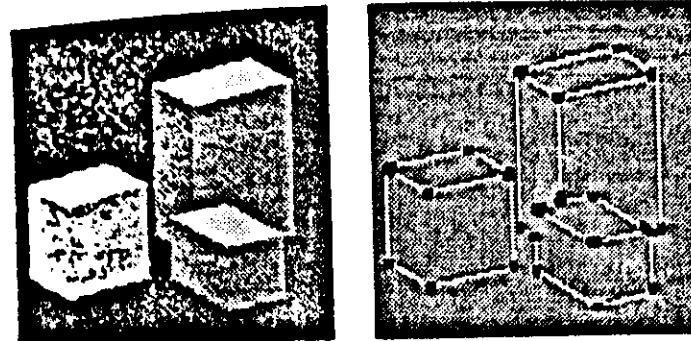


Figure 2.16: Corner and junction detection: synthesised image. Dark blobs mark discontinuities in tangent angle, obtained from fitting weak strings to the entire "graph" of edges.

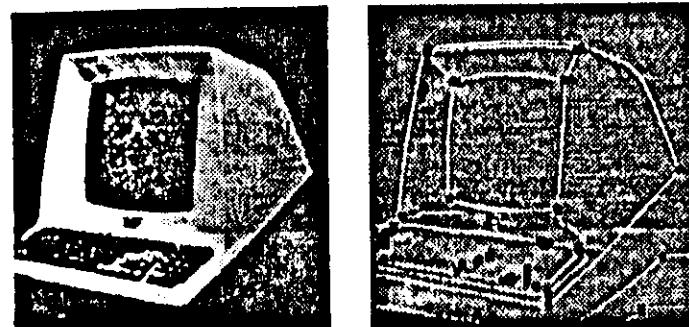


Figure 2.17: Corner and junction detection: real image.

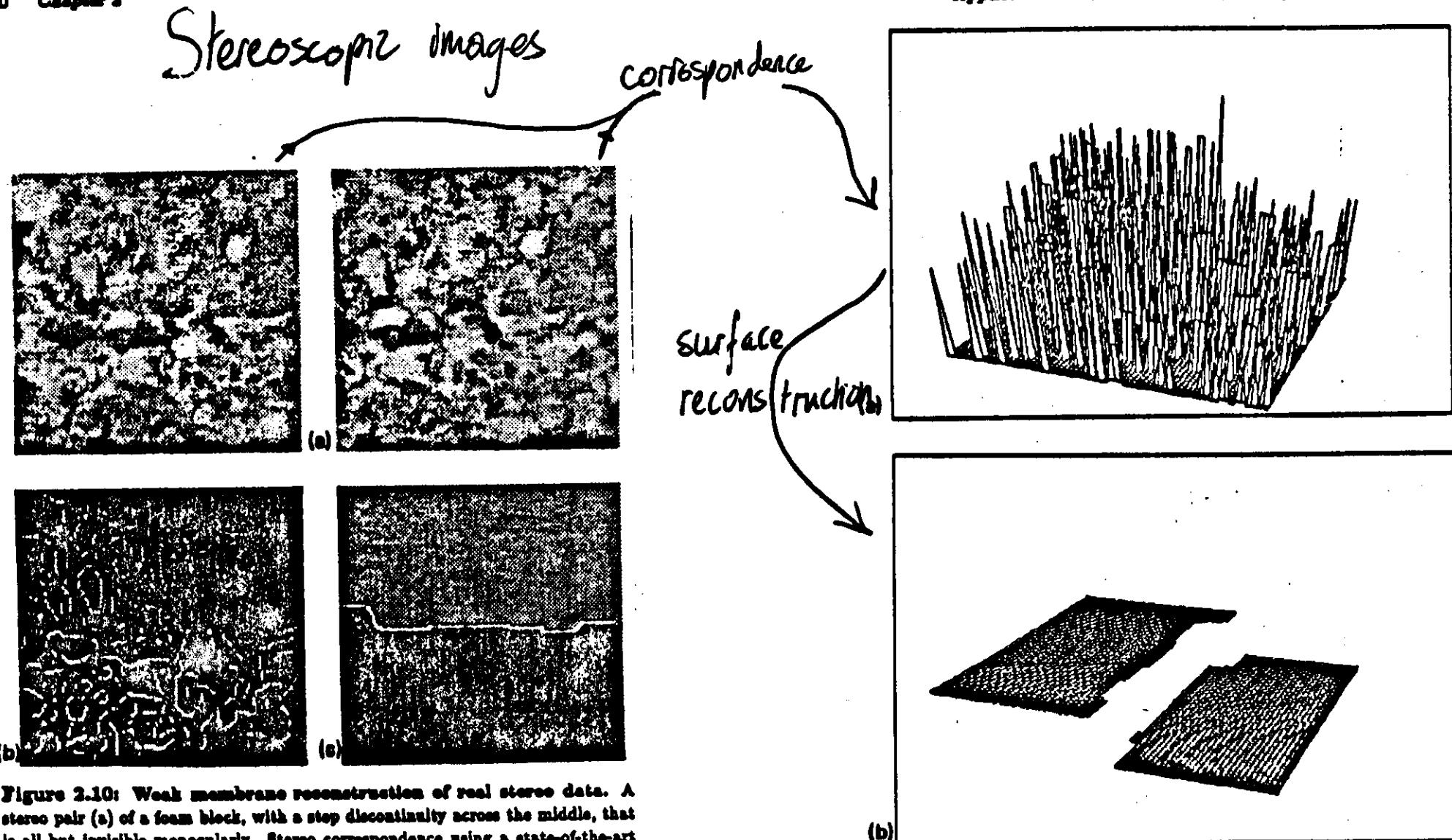


Figure 2.10: Weak membrane reconstruction of real stereo data. A stereo pair (a) of a foam block, with a step discontinuity across the middle, that is all but invisible monocularly. Stereo correspondence using a state-of-the-art matching algorithm (Pollard et al. 1988) produces depths along sparse contours (b). The reconstructed surface is shown with its contour of discontinuity (c).

Figure 2.11: Isometric plots of the stereoscopic data from figure 2.10b and the reconstructed surface in figure 2.10c.

Weak elastic models.

Elastic Model.

Introducing Weak Continuity Constraints 45

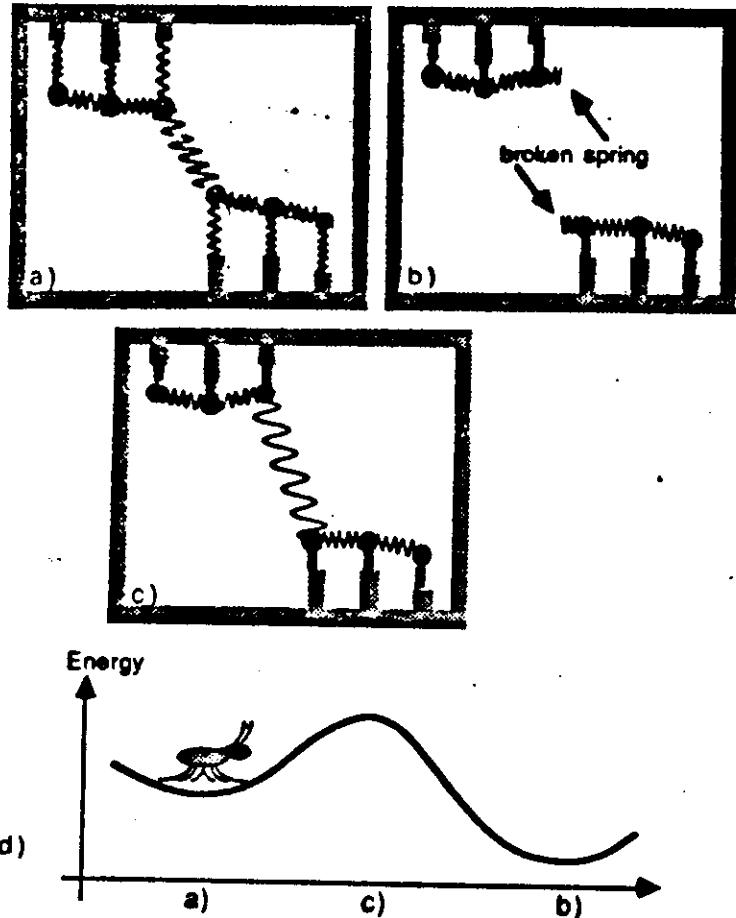


Figure 3.4: Non-convexity: the weak string is like a system of conventional vertical springs with "breakable" horizontal springs as shown. The states (a) and (b) are both stable, but the intermediate state (c) has higher energy than either (a) or (b). Suppose the lowest energy state is (b). A myopic fly with vertigo, crawling along the energy transition diagram (d) thinks state (a) is best - he has no way of seeing that, over the hump, he could get to a lower state (b).

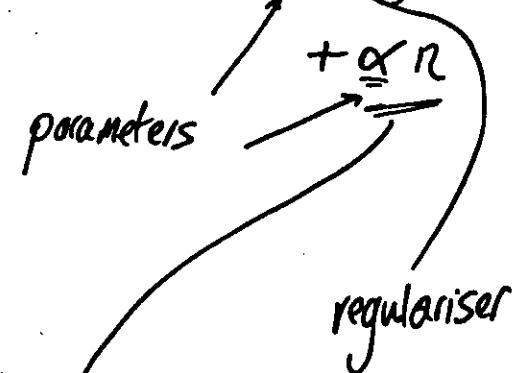
Simplest model: "weak string" reconstruction

Given $d(x)$, $x \in [a, b] \leftarrow$ data
Minimise w.r.t. $u(x)$, $x \in [a, b]$

$$\text{and } B = \{b_0, b_1, \dots, b_{n-1}, b_n\} \quad \begin{matrix} b_0 = a \\ b_n = b \end{matrix}$$

breakpoints

$$E = \sum_{i=0}^{n-1} \int_{b_i}^{b_{i+1}} \left\{ (u(x) - d(x))^2 + \frac{\lambda}{2} u''(x)^2 \right\} dx$$



Discretise via finite elements \rightarrow NON-CONVEX

2D: "weak membrane" reconstruction.

given $d(x,y)$, $(x,y) \in D$

minimise w.r.t $u(x,y)$, $(x,y) \in D$

& set of curves $C \subset D$

$$E = \int_{D \setminus C} \left\{ (u - d)^2 + \underline{\lambda^2} (\nabla u)^2 \right\} dx dy$$

$$+ \underline{\alpha} |C|$$

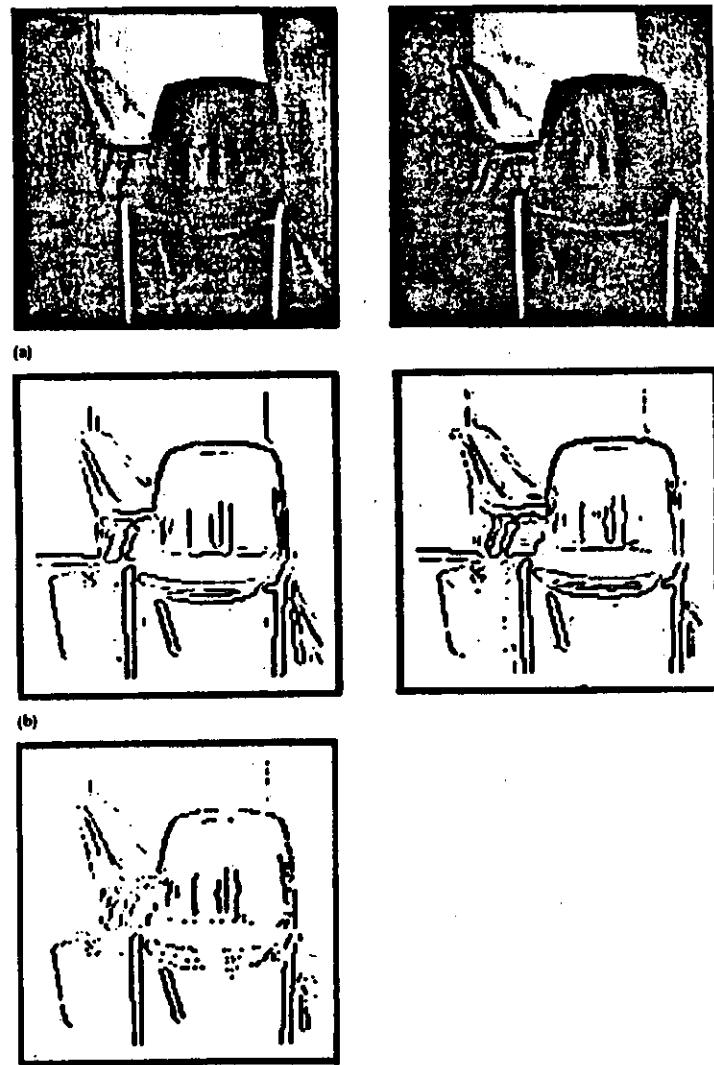
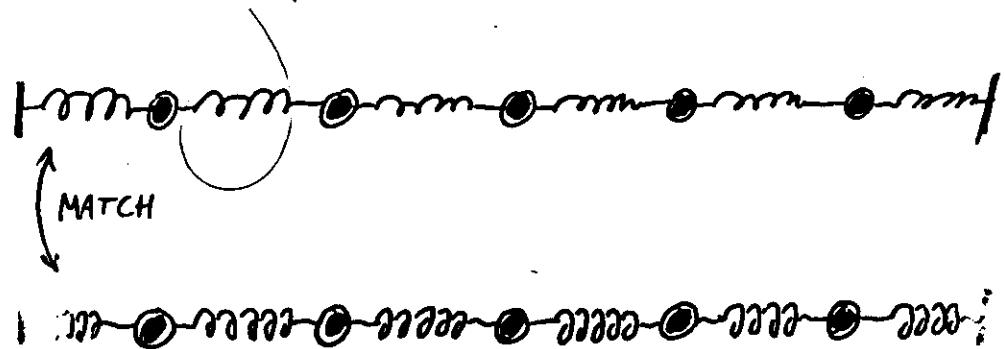


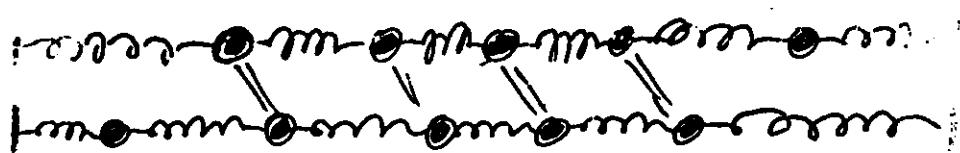
Figure 7. The performance of PMF on a stereo pair comprised of natural images of an office scene. (a) Stereo pair arranged suitably for crossed-eye fusion. (b) Edge-like primitives extracted with the use of a Marr-Hilditch operator. (c) Matches found by PMF, with intensity used to code relative disparities (dark = near, light = far). See text for further details.

JULES2 - GLOBAL STEREOVISION

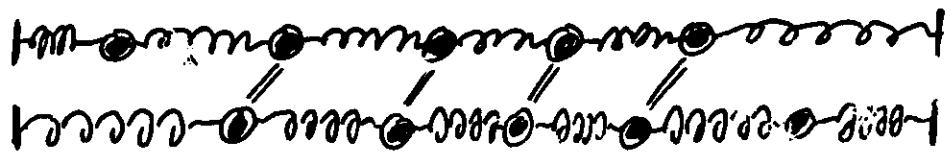
Cooperative processes:



MATCH A



MATCH B/



e.g. Stereoscopic Matching:

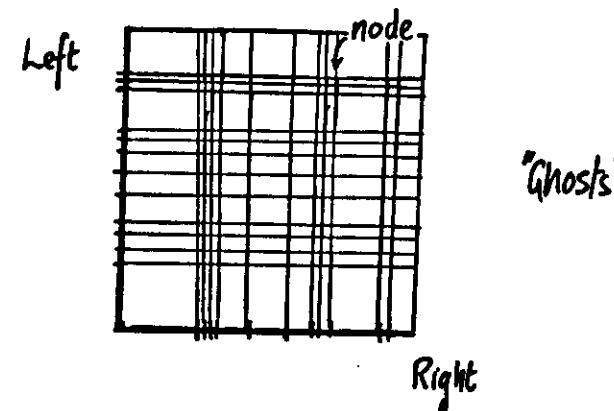
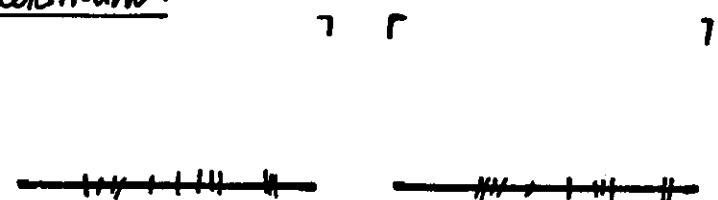
(Julesz, 1971 ; Marr + Poggio, 1976)

III Stereoscopic correspondence problem

A number of solutions have been proposed that are computationally effective:

Marr + Poggio ; Mayhew, Friston, Pollard ; Baker + Binford ;
Ohta + Kanade ; Nass Terzopoulos + Witkin.

Epipolar constraint:



through the nodes,

- * whose gradient is positive
- * gradient rarely vertical or horizontal
- * visits as many L/R features as possible
- * fits paths on neighbouring epipolar line-pairs as closely as possible

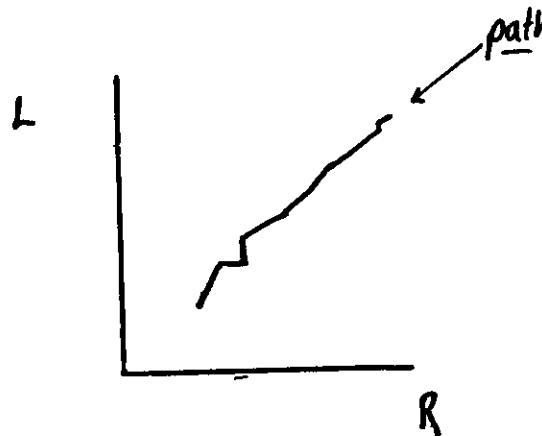
constraints

ordering

Uniqueness
(disparity gradient)

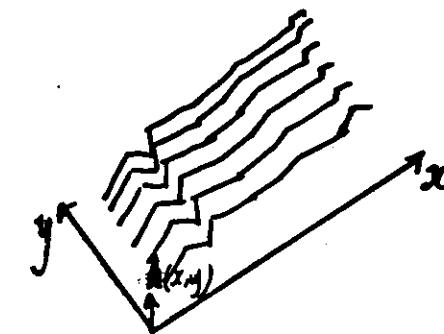
"completeness"

figural
continuity



Kass - Terzopoulos - Within

- "scale space matching":



e.g.

$$\min_{h(x,y)} \left\{ \iint (f_L(x+h(x,y), y) - f_R(x,y))^2 dx dy + \lambda \iint (\nabla h)^2 dx dy \right\}$$

(solved using a continuation method with variable image blur - c.f. Marr & Poggio Within)

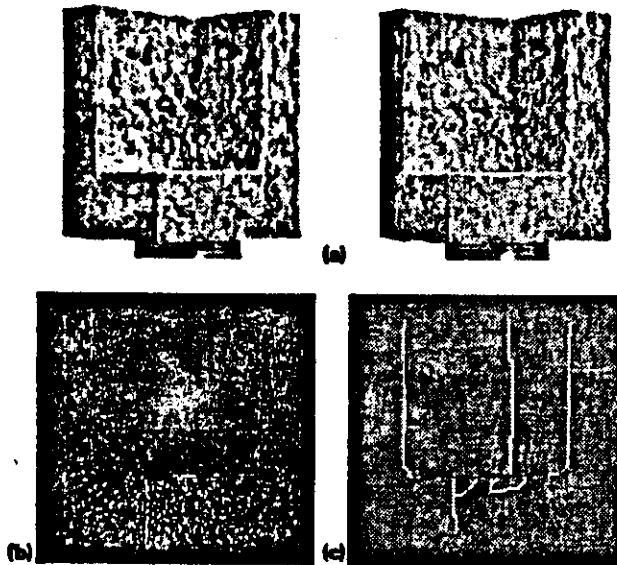


Figure 2.12: Applying a weak plate to sparse, stereoscopic depths.
(a) Stereo image-pair. (b) Stereoscopically matched features. Both steps and creases are recovered by the plate (c), shown superimposed on the reconstructed, dense depth-map. Creases are marked as thin white lines, whilst steps are marked as thick, black lines. A few spurious creases have been generated as a result of "ghost" matches in the stereoscopically viewed texture.

