

## FROM STEP EDGE TO LINE EDGE: COMBINING GEOMETRIC AND PHOTOMETRIC INFORMATION

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### ABSTRACT

As a Gradient detector produces two extrema when applied to a line, we propose an original method which is based on such a detector but which appropriately responds to both step and line edges. The main ideas are first to identify line contours using geometric and photometric properties and second to substitute a line for a single contour using a simple geometric algorithm.

### 1. INTRODUCTION

Early vision begins with the computation of a compact description of the raw image intensity. Physical edges provide fundamental visual information since they correspond to the discontinuities of the physical and photometric properties of the objects. Consequently, edge detection consists in characterizing these variations in terms of the physical phenomena at their origin. The most common edge detectors deal with step edges [10, 2, 4]. However, a grey scale image contains various kinds of edges coming from different scene events and different physical phenomena. For example, an object on a uniform background or fingerprints give rise to line contours, called pulses or roofs, in the digitalized image. When applied to such an image, the Canny detector [2] or a similar one produces two extrema rather than one. For this reason, specific detectors, like line detectors [17] or ridge detectors [5, 7], have been created. Other line detectors directly work on binary or grey scale images using a thinning algorithm [12, 3]. However, a line or a ridge detector gives spurious responses to other kind of edges. Works have been proposed to select appropriate step edge detectors to find a given edge [8, 18]. Our approach focuses on both step and line edges.

We give in the second section the properties of the response of a line to a step edge detector. These properties are used to identify lines included in the image. The search and location of line edges include three steps. In the first step (cf. Section 3), all possible pairs of closed and parallel segments are considered as candidate lines. Pairs which are generated by lines must have the typical profiles of the roof and pulse edges. In the second step (cf. Section 4), the pairs of segments are connected to complete the corresponding line edge, and the extremities of the lines are examined. In the third step (cf. Section 5), the peaks are searched. Examples of the results we obtain are presented in sixth section.

### 2. PROPERTIES OF A LINE EDGE

We define the properties of a line edge in terms of the Gradient of the Gaussian in the following way (Fig. 1.a):

$$C(x) = A_0 H(x - l_0) - A_1 H(x - l_1),$$

where  $A_0$  and  $A_1$  are the left and right contrast of the line edge, and  $H$  is the Heavyside function [15]. The response

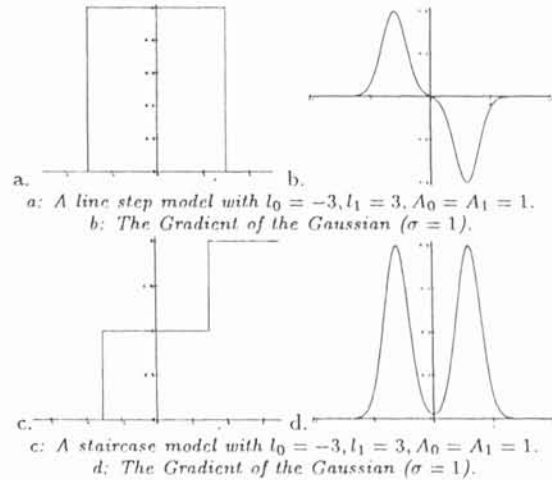


Figure 1. The line step and staircase models [Tab94].

of this model to the first derivative of the Gaussian is:

$$F_x(x, \sigma) = -\frac{1}{\sigma^2} (A_0 g_\sigma(x - l_0) - A_1 g_\sigma(x - l_1)),$$

where  $g_\sigma(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{x^2}{2\sigma^2}}$  is the Gaussian filter. This response has two extrema (Fig. 1.b) which generate a double step in 2D. On these contours, an edge following [6] and a polygonal approximation [16, 9] generate two close segments, theoretically parallel, which are the edges of the line contour. However, a double contour can also be generated by a double step, shaped like a staircase (Fig. 1.c). With the same notations, a staircase model can be defined in the following manner [15]:

$$E(x) = A_0 H(x - l_0) + A_1 H(x - l_1),$$

$$F_x(x, \sigma) = -\frac{1}{\sigma^2} (A_0 g_\sigma(x - l_0) + A_1 g_\sigma(x - l_1)).$$

Figure 1.d shows the response of function  $F_x$ . The norm of the Gradient presents two extrema for both staircase and line models (fig. 1.b and 1.d).

We use the profile to characterize the two contour models. The profile of a double contour corresponds to the three means of the grey levels of the three zones respectively on the left hand side, in the middle and on the right hand side of the double contour. For a line edge model, the mean of the middle zone is either greater or less than the other two. For a staircase model, the mean of the middle zone is bounded by the other two. Therefore, a line is defined by its profile and two chains of parallel segments such as their distance is smaller than six times the standard deviation of the smoothing filter. This distance is roughly the size of the Gaussian filter [14, 15].

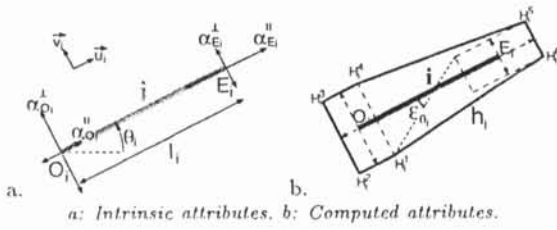


Figure 2. A segment and its attributes.

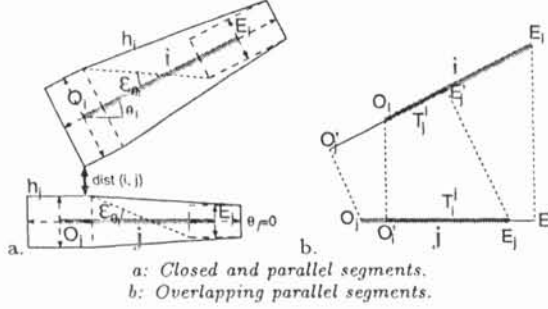


Figure 3. Two segments  $i, j$  with (1), (2) and (3) fulfilled.

### 3. LINE STEP COMPUTATION

A segment  $i$  is characterized by intrinsic attributes:  $O_i$ , the origin of the segment,  $E_i$ , its extremity,  $l_i$ , its length and  $\theta_i$ , the angle between the segment and the horizontal direction (Fig. 2.a). Each extremity  $S$  of  $i$  is associated with intrinsic attributes  $\alpha_S^{\parallel}$  and  $\alpha_S^{\perp}$  which represent the non-biased error on the location of  $S$  in directions respectively parallel and orthogonal to  $i$ . These attributes are assumed to be independent and define a so-called uncertainty rectangle for each extremity of  $i$ . A segment is considered as significant if  $\alpha_{O_i}^{\parallel} + \alpha_{E_i}^{\parallel} \ll l_i$ . Using these attributes, we define a so-called uncertainty hexagon  $h_i$  as the smallest region including  $i$  (Fig. 2.b). If  $\alpha_{O_i}^{\perp} > \alpha_{E_i}^{\perp}$ , the vertices  $H_i^{1..6}$  of this hexagon are defined as follows:

$$\begin{cases} H_i^{1..4} = O_i \pm \alpha_{O_i}^{\parallel} \cdot \vec{u}_i \pm \alpha_{O_i}^{\perp} \cdot \vec{v}_i \\ H_i^{5..6} = E_i + \alpha_{E_i}^{\parallel} \cdot \vec{u}_i \pm \alpha_{E_i}^{\perp} \cdot \vec{v}_i \end{cases}$$

where  $\vec{u}_i$  is the unit vector parallel to  $i$  and  $\vec{v}_i$  is the unitary vector orthogonal to  $i$ . Each segment  $i$  is provided with a confidence rate which only depends on the error  $\epsilon_i^{\theta} = \arctan\left(\frac{l_i - \alpha_{O_i}^{\parallel} - \alpha_{E_i}^{\parallel}}{\alpha_{O_i}^{\perp} + \alpha_{E_i}^{\perp}}\right)$  on the attribute  $\theta_i$ .

A pair  $C_{ij}$  of segments  $i$  and  $j$  are considered as parallel if:

$$|\theta_i - \theta_j| \leq \Upsilon + \epsilon_i^{\theta} + \epsilon_j^{\theta} \quad (1)$$

In our test data set,  $\Upsilon$  varies from 1 to 4 degrees. The distance between two segments  $i$  and  $j$  is defined as  $dist(i, j) = dist(h_i, h_j) = \min_{k,l=1..6} d(h_i^k, h_j^l)$ , where  $h_i^k$  and  $h_j^l$  are the sides of the uncertainty hexagons  $h_i$  and  $h_j$ , and  $d(a, b)$  is the Euclidean distance between two segments. The two segments  $i$  and  $j$  are considered as close to each other if:

$$0 < dist(i, j) \leq D_{int} \quad (2)$$

where  $D_{int}$  is the maximum internal width of a line (Fig. 3.a). It is computed from the width of the filter used by the edge detection (cf. Section 2). Any pair of segments verifying (1) and (2) is then considered as a possible line.

Let  $C_{ij}$  be such a pair. Let  $O'_i$  and  $E'_i$  (resp.  $O'_j$  and  $E'_j$ ) the projections of  $O_i$  and  $E_i$  (resp.  $O_j$  and  $E_j$ ) on the

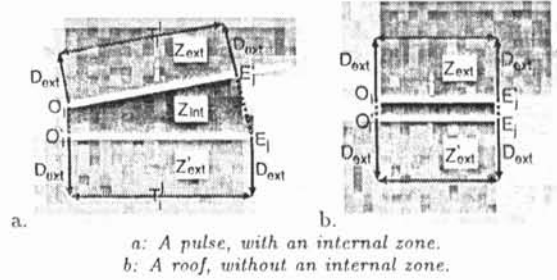


Figure 4. The two sorts of line edge.

supporting line of  $j$  (resp.  $i$ ) (Fig. 3.b). If the segments  $[O'_i, E'_i]$  and  $j$  (resp.  $[O'_j, E'_j]$  and  $i$ ) has a common part  $T_i^j$  (resp.  $T_j^i$ ),  $i$  and  $j$  are called *overlapping parallel segments*.  $C_{ij}$  is a line edge if the overlapping part is greater than the minimum length of a line,  $D_{min}$ . We considered  $D_{min}$  must be greater than  $D_{int}$ , in order to ensure line edge is longer than thick. Thus  $C_{ij}$  must verify:

$$\min(l_{T_i^j}, l_{T_j^i}) \geq D_{min} \quad (3)$$

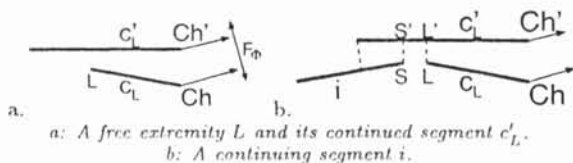
where  $l_{T_i^j}$  and  $l_{T_j^i}$  are the lengths of  $T_i^j$  and  $T_j^i$ .

A pair  $C_{ij}$  verifying (1), (2) and (3) is associated with three zones  $Z_{ext}$ ,  $Z_{int}$  and  $Z'_{ext}$  which respectively represent the left external, internal and right external regions of the candidate line edge (Fig. 4.a).  $Z_{int}$  is the quadrilateral defined by  $T_i^j$  and  $T_j^i$ .  $Z_{ext}$  (resp.  $Z'_{ext}$ ) is a rectangle defined by  $T_i^j$  (resp.  $T_j^i$ ) and  $D_{ext}$ , which is the mean external width of a line and which is considered equal to six times the standard deviation of the smoothing filter. Let  $\overline{Z_{ext}}$ ,  $\overline{Z_{int}}$  and  $\overline{Z'_{ext}}$  be the mean values of the pixels of the original image in the zones  $Z_{ext}$ ,  $Z_{int}$  and  $Z'_{ext}$ . If the pair  $C_{ij}$  result from a line edge contour,  $\overline{Z_{int}}$  is superior or inferior to the others. However, because of the noise and the discretization of the image signal, the mean value of the pixels in a given zone is all the less significant as this zone is small. From their definition and equation (3), the minimum surface of  $Z_{ext}$  and  $Z'_{ext}$  is  $D_{ext} \times D_{min}$ , which is experimentally large enough to  $\overline{Z_{ext}}$  and  $\overline{Z'_{ext}}$  be significant. However, from equations (1), (2) and (3), the surface of  $Z_{int}$  has no lower bound. Then we arbitrarily consider that  $\overline{Z_{int}}$  is not significant if the surface of  $Z_{int}$  is less than a given constant  $D_{surf}$ , which is roughly  $(D_{min})^2$  in our test data set. In this case, the profile of the line edge only includes  $Z_{ext}$  and  $Z'_{ext}$ : We consider that  $C_{ij}$  is a roof edge if the local maxima of the Gradient of the Gaussian which generated the segments  $i$  and  $j$  have opposite signs (Fig. 4.b). This simplified profile is not robust but allows the roof edge to be distinguished from the double step edge (Fig. 1.b).

To sum up, a pair  $C_{ij}$  is generated by a line edge if it verifies (1), (2), (3) and:

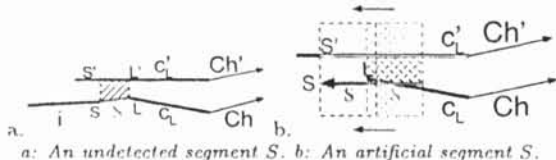
$$\begin{cases} Sgn(GRAD(i)) \neq Sgn(GRAD(j)), \\ \text{with } Surface(Z_{int}) < D_{surf}, \\ \overline{Z_{int}} > \max(\overline{Z_{ext}}, \overline{Z'_{ext}}) \text{ or } \overline{Z_{int}} < \min(\overline{Z_{ext}}, \overline{Z'_{ext}}), \\ \text{with } Surface(Z_{int}) \geq D_{surf}. \end{cases} \quad (4)$$

If several pairs verify these equations for a same segment  $i$ , the segment  $j$  is selected so as to be the closest to  $i$ . The pair  $C_{ij}$  then become the line edge  $C\{i\}\{j\}$ , which is completely defined by its profile  $F_{C\{i\}\{j\}}$  and its two chains  $Ch$  and  $Ch'$ . For the moment, each of these chains includes a single segment,  $i$  and  $j$  respectively. We now try and continue the chains using segments which do not yet belong to a line edge.



a: A free extremity  $L$  and its continued segment  $c'_L$ .  
b: A continuing segment  $i$ .

Figure 5. The continued and continuing segment



a: An undetected segment  $S$ . b: An artificial segment  $S$ .

Figure 6. Detection of the extremities.

#### 4. CONTINUING A LINE EDGE

Let  $\Phi$  be a line edge. It is defined by a profile  $F_\Phi$  and two ordered chains of segments  $Ch$  and  $Ch'$ . A so-called *free extremity* of a line edge is the extremity of one of the chains which projects on the other chain. The segment on which this free extremity is projected is called *continued segment*. Let  $c_L$  be a segment from  $Ch$  having a free extremity  $L$  and  $c'_L$  be the continued segment of  $Ch'$  on which  $L$  projects (Fig. 5.a). A part of the segment  $c'_L$  is not yet used to form the line edge  $\Phi$ . We then search for a segment  $i$  which do not yet belong to a line edge, such that  $C_{ic'_L}$  verifies (1), (2), (3) and (4), i.e. such that  $i$  and  $c'_L$  form a line edge  $C$ . This line edge must have the same profile and the same orientation as  $\Phi$ . The segment  $i$  is called the *continuing segment* of the line edge  $\Phi$  at  $L$ .

Let  $S$  be the origin of  $i$  such that  $S$  is on the same side as  $L$  with respect to  $c'_L$ ;  $i$  and  $c_L$  have the same orientation, given by the line edge  $\Phi$ . Let  $S'$  and  $L'$  be the respective projections of  $S$  and  $L$  on  $c'_L$ . We can deduce from the study of the ordered set of points  $(S, L, L', S')$  that the line edges  $C$  and  $\Phi$  form either the same line, either two different connected lines or two different non connected lines. In the optimal case,  $S$  and  $L$  are the same point: the segment  $i$  is connected to the chain  $Ch$  at  $L$ .

When the segment  $i$  intersects the line  $(L, L')$  in  $Y$ , we consider that there are a possible Y-shape junction between the two line edges  $\Phi$  and  $C$  and also a third line edge. The line edge  $\Phi$  is then continued using the segments  $[L, Y]$  and  $i$ .

When the segment  $i$  does not intersect the line  $(L, L')$  and  $C$  and  $\Phi$  form the same line edge,  $(S, L, L', S')$  corresponds to a zone of the same kind as  $Z_{int.}$ , in which the segment  $[S, L]$  has not been detected (Fig. 6.a). This anomaly is caused either by a line edge whose width is close to that of the filter used by the edge detection or by an unbalanced line edge which divides the original image into two regions having very different intensity levels. If there is only one line edge, we consider that the pair  $C_p$  including segments  $[S, L]$  and  $[S', L']$  must satisfy equations (1), (2), (3) and (4). However, as the distance  $(S, L)$  may be arbitrarily long, equation (3) can not be verified and the surfaces of the external zones defined by  $C_p$  no longer have lower bounds. Therefore, the first condition of equation (4) is only true if either  $Surface(Z_{ext}) \leq D_{surf}$  or  $Surface(Z'_{ext}) \leq D_{surf}$ . If  $C_p$  verify these restricted conditions, the line edge  $\Phi$  is continued using the segments  $[L, S]$  and  $i$ .

This process is iterated until all the free extremities of  $\Phi$  can not be continued. Such a method provides good results on the body of the line edge but the extremities of the line edge are not precisely located. The junctions between the extremities of a line edge and other edges of

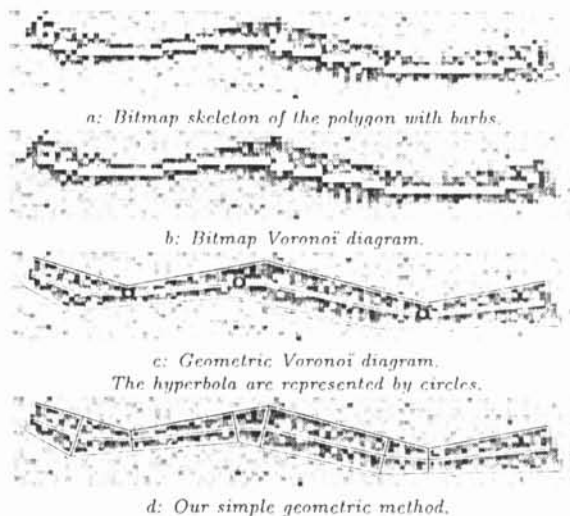


Figure 7. Computation of the peak.

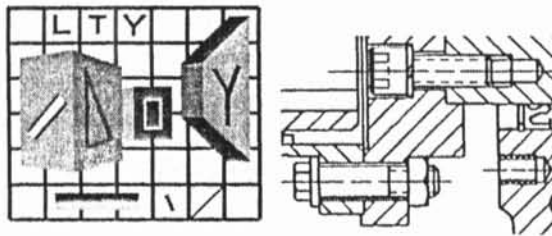
ten decreases the quality of the segments. In most cases, only one of the two segments constituting the extremities of the line edge is detected. This segment is the continued segment  $c'_L$  of the chain  $Ch'$ , associated with the free extremity  $L$  of the chain  $Ch'$ . This case is similar to the continuation of a line edge, except that there is no continuing segment which allows the chain  $Ch$  to be continued at  $L$ . We thus create an artificial segment  $s$  such that it forms a line edge of minimum width with  $c'_L$ ;  $s$  and  $c_L$  are parallel with a full overlapping and the middle of  $s$  is on  $c_L$ .  $s$  is then gradually moved towards the extremity of the line edge. When either equation (4) is no longer verified or the projection  $S'$  of the extremity  $S$  of  $s$  projects onto the extremity of  $c'_L$ , the extremity of the line edge is reached. The segment  $[S, L]$  is then added to the chain  $Ch$  and the point  $S'$  becomes the new extremity of  $c'_L$ : The line edge  $\Phi$  is complete.

All the line edges of the image are processed in that way. We now have to solve a last problem: the computation of the peaks.

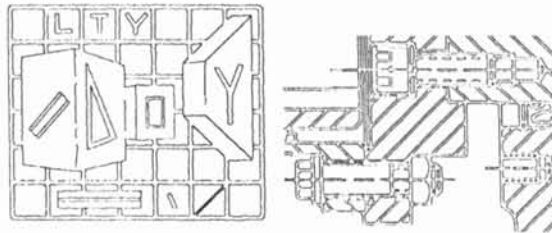
#### 5. COMPUTATION OF THE PEAKS

The ideal peak of a line edge is defined as the location of the physical discontinuity which generates the line. Unfortunately, this location is hard to obtain. As the mean width of a line edge never exceeds a few pixels, we consider that the peak is centred on the line. Respecting our conventions, the centre corresponds to the set of inner points equally distanced from the two chains of segments representing the line edge. We compared four methods to compute these points:

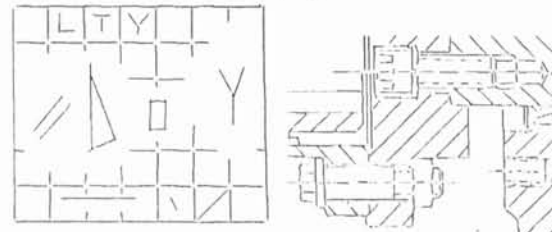
- A skeletonization [13] of the polygon obtained by connecting the extremities of the two chains of segments (Fig. 7.a): The result is a completely connected graph of pixels and is located at the exact centre of the line edge. However, the detected peaks are chains of pixels instead of segments. Moreover, the extremities of line edges, as well as the portions of line edges with a high curvature, are provided with parasitic barbs.
- A bitmap Voronoi diagram [11] in this same polygon: We consider that a pixel belongs to the diagram if it is equally distanced from at least two non consecutive segments of the polygon and if there is no other segment which is closer to the pixel (Fig. 7.b). Although this method does not produce barbs, the resulting peaks are also chains of pixels and the extremities of the line edges are truncated.



A synthesized noisy image and a technical drawing.



The step edges.



The extracted lines with our geometric method.

Figure 8. Two examples of our results.

- A geometric Voronoi diagram [1] in the polygon (Fig. 7.c): This method has a high complexity and produces piecewise defined curves, made of portions of straight lines and parabols, which cannot be easily used.
- A geometric method which gives an approximation of the centre of the two chains of segments (Fig. 7.d): All the extremities of the segments belonging to one of the chains are projected on the other. The projected points and the extremities of the segments create new segments. The chain determined by the middle points of these segments form the peak. As the two chains of segments representing the line edge are locally parallel, the new chain obtained in this way is close to a geometric Voronoi diagram but is easier to use.

## 6. EXPERIMENTAL RESULTS

Experiments have been performed on many kinds of numerical images. We present here only synthesized noisy image and technical drawing, in Figure 8.

If few lines edges are not detected, the most part of lines edges is globally relevant and very smoothed. The search for the extremities, as explained in section 4, continues the line edges whose ending segments are not detected in the original contour image. Line edges and staircases are efficiently identified by their profile. However, the polygonal approximation of curved line edges generates segments which are too small to be considered parallel with overlapping.

## 7. CONCLUSION

This paper describes a method to identify line contours, such that roof and pulse edges, from step edges. A line edge is modelled as overlapping parallel segments having

the profile of a line edge. Thus, our line detector can deal with both steps and lines. We use a simple geometric algorithm to substitute every extracted line edge for a single line. Experimentations prove the reliability and robustness of our approach. Few line edges are actually missed and extracted lines are well located. Connectivity between other edges is globally reliable, and we are currently working on the location of all kinds of junctions between step and line edges.

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