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**On The Representation And Generation Of
Loosely-Packed Arrangements of Rectangles**

by

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On the representation and generation of loosely-packed arrangements of rectangles

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Abstract

Several computer programs that enumerate rectangular dissections as solutions to certain Livoui problems have established a distinct paradigm for dealing with the crucial theoretical issues involved. The present paper suggests an extension of the paradigm to include "loosely-packed arrangements of rectangles", which are of wider applicability in an architectural context. The paper introduces *orthogonal structures* to represent these arrangements and establishes the conditions for well-formedness for these structures. It presents a grammar to enumerate orthogonal structures and suggests that best use is made of the grammar if it is incorporated into a generative expert system, able to serve as a vehicle to discover, encode and utilize a broad range of constraints and criteria in the generation of layout alternatives.

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I Background

A useful classification of approaches towards the computer-assisted generation of floor plans is given in [7]:

1. Automated appraisal of layouts that have been generated by traditional means
2. Stepwise automatic layout generation interactively guided by manual selection of desirable partial solutions
3. Nonexhaustive automatic generation satisfying given constraints
4. Exhaustive automatic generation satisfying given constraints
5. Automatic generation of optimal or quasioptimal layouts under given constraints.

Among these, approach 4 demands the most elaborate theoretical foundation. It is particularly attractive for investigations in which the entire set of solutions to a given problem is to be put at the designer's (or researcher's) disposal. For example, the solution set can be systematically searched for *efficient* or *Pareto-optimal* solutions, each of which is distinguished by a particular trade-off between advantages and disadvantages that warrant a closer analysis and comparison (see, for example, [11] for a demonstration of this situation, albeit within a different context).

Starting with [9] and [13] and continued through [10] and [5], work on the exhaustive enumeration of solution sets has produced a particular approach which, by now, has established itself as a fully developed paradigm. This paradigm achieves great conceptual clarity by drawing a clean distinction between, on the one hand, the quantitative and continuous properties of a solution (such as the dimensions of the spaces allocated) and, on the other hand, some of its qualitative or discrete properties (particularly the geometric or spatial relations between the allocated spaces). The paradigm stresses the importance of using a formalized representation for properties of the second type and calls for an explicit specification of the necessary and sufficient conditions under which such representations are to be considered 'syntactically correct', that is, every representation of a solution satisfies these conditions and every representation that satisfies these conditions represents a solution. In the enumeration of solution sets, these representations play a crucial role in two ways:

- (1) Each representation is an *abstraction* since it suppresses certain properties of the solution it describes. Different solutions can therefore have the same representation, and each representation describes not a single solution, but an entire class or subset of solutions. Under a suitable representation, the possibly infinite set of solutions is divided into a finite set of subsets which can be enumerated by generating all well-formed representations as *objects*. The generation itself is based on construction rules, and explicit proofs are required to assure that the set of well-formed representations is both *closed* and *complete* under application of these rules: that is, every rule application creates a well-

representation and every such representation is generated by a sequence of rule applications. Apparently, **inductive** proofs of **these** results are straight-forward if the rules are formulated as recursive re-write rules.

(2) Each representation must record the spatial relations characterizing the solutions it describes accurately enough to allow for an explicit formulation of the *dependent or inter-element* constraints that restrict the dimensions of the allocated spaces and vary as the spatial relations between spaces change (an elaboration of this point can be found in [5]). After a representation has been generated, a particular member of the subset of solutions described by this representation can be found by formulating all constraints imposed on the dimensions of the allocated spaces and by computing a set of dimensions which simultaneously satisfy these constraints. If this process fails, the subset does not contain a solution that is feasible for the particular design problem at hand. This step can therefore be viewed as a test that determines the *semantic correctness* of a representation with respect to the given problem.

This paradigm has been developed in connection with allocation problems that are restricted in two ways: (1) the tasks that can be solved are narrowly defined with respect to the criteria or constraints considered; (2) the solutions that can be generated are limited to *rectangulations* or *rectangular dissections* that is, arrangements of rectangles that are 'densely-packed' within a larger rectangle. The present paper outlines methods for extending the applicability of the paradigm beyond both types of limitations. The particular directions suggested for these generalizations will be motivated through two examples.

Example 1:

Table 1 shows the four spaces of an efficiency apartment together with dimensional and area constraints commonly imposed upon the design of such apartments (it is assumed that the area is bordered from the east by a corridor and from the west by an exterior wall). Figure 1 shows four solutions to this problem; they were generated by the program DIS, a floor plan generator which produces rectangular dissections as solutions to design problems of the type shown (see the description of the program in [5]).

The first two layouts are well-known standard solutions, while the last two, although satisfying the constraints, would never be seriously considered even by inexperienced designers: they too obviously violate common principles, conventions or rules of good design. Solution 3, for example, contains a hall that is unreasonably large and occupies valuable space along the exterior wall that could be used better for the other rooms. The rules violated in layouts 3 and 4 and other layouts generated by the program are not explicitly stated in an architectural program or design brief, but are nevertheless used by experienced designers; they might reflect years of experience, and the designers using them are often not aware of them unless confronted with a solution that obviously violates them. For me, the most intriguing aspect of the work with the program DIS was the discovery of precisely these implicit rules of good design. The rules are listed in Table 2.

Space	Dimensional constraints		Required adjacencies
1 Hallway	Min. dimension	1.20 m	East, Space 2, Space 4
2 Living/sleeping area	Min. dimension	3.60 m	West, Space 1, Space 3
	Min. area	22.00 m ²	
3 Kitchenette	Min. dimension	1.80 m	Space 2
	Min. area	4.20 m ²	
4 Bathroom	Min. dimension	1.80 m	Space 1

Table 1: The spaces in an efficiency apartment

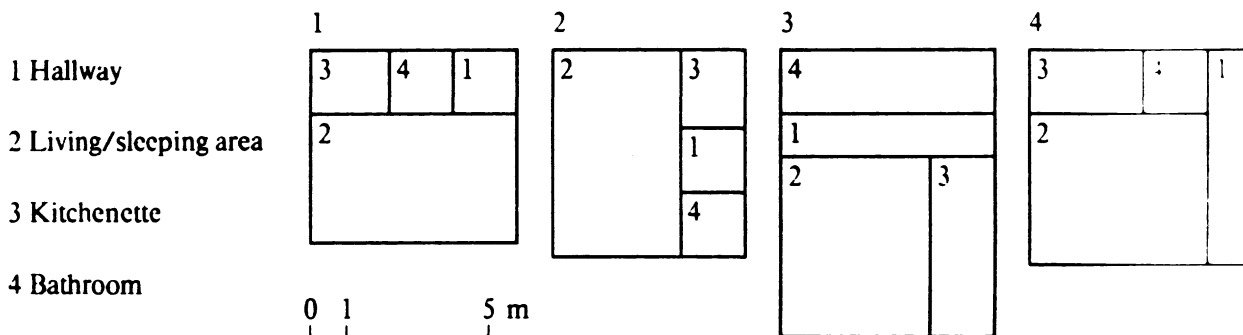


Figure 1: Four layouts satisfying the constraints of Table 1

emerged, in fact, as an effective vehicle to detect these rules, which, for the most part, are not systematically documented anywhere (e.g. in textbooks).

I was in many cases able to express these rules for a concrete task in terms of the constraints accepted by the program. This is, however, a laborious process and must be repeated for each new problem to be solved. The program would become more useful if it provided a mechanism for distinguishing between general and specific rules that apply over a broad range of applications, and those constraints that specify a particular design task. Rules of the first kind should be incorporated into a general knowledge base that is activated for each problem to be solved, but does not have to be explicitly specified in each case. Furthermore, the addition of new rules to the knowledge base and the modification of existing ones should be as easy as possible and not involve major programming efforts. But these are precisely the characteristics of an *expert system*, which is a means to discover and express the implicit knowledge experts use in solving problems specific to their domain of expertise (see [8] and [12] for a general discussion; the latter reference contains a useful bibliography).

Section 4 will specify an expert system for architectural design which, together with the generalizations suggested by the next example, will greatly increase the applicability of such programs as D1S.

Example2:

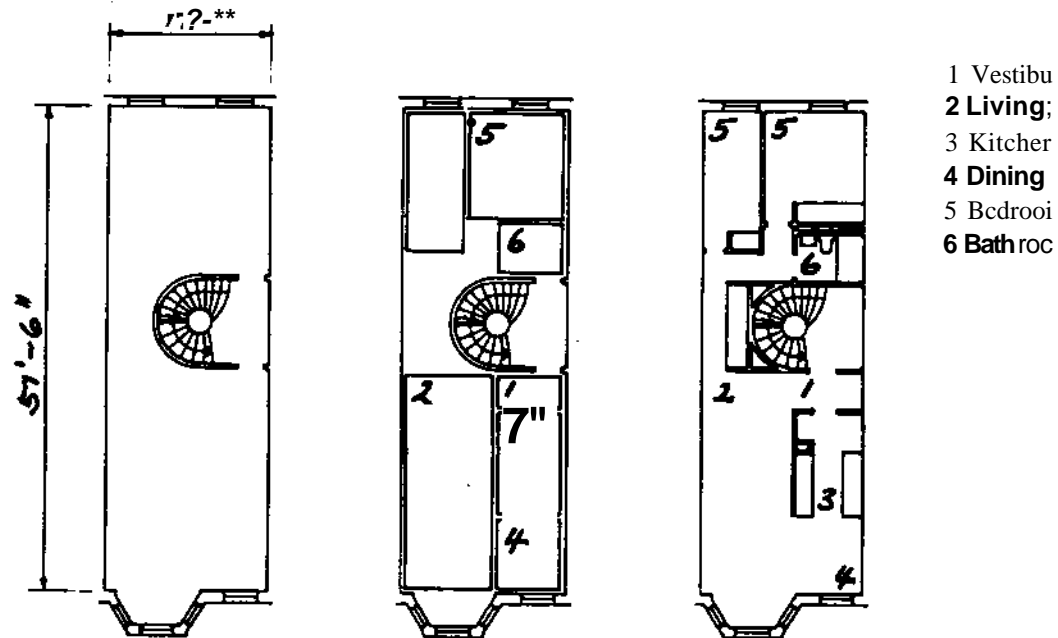


Figure 2: Stages in the design of an apartment

Figure 2(a) shows the structural walls on a typical floor of a terraced house in the Boston South End (which I once measured while working for John Sharratt Associates). The house was to be remodelled and turned into a multi-family dwelling with a two-bedroom apartment on each floor. Figure 2(b) shows an intermediate stage in the design process in which the major spaces have been allocated and given a rough shape. In this stage, no attention is paid to the form of the partitions needed to separate the spaces from each other or the required circulation area delineated in any precise form. The spaces are treated more or less as shapes, and prime attention is given to the relations between them (and the context).

Space-defining elements such as walls or partitions are introduced in Figure 2(c) where the focus has shifted from spaces to the physical elements defining them. The shape of some spaces is modified in the process, and auxiliary spaces such as hallways or closets are added.

Programs such as DIS are inadequate to model the more strategic phase in this process. They generate densely-packed arrangements of spaces directly from a problem specification; all spaces are immediately given a precise form and treated formally the same. Auxiliary areas must be specified at the outset along with the rooms they serve, and spaces that may have a non-rectangular outline must be divided into several components. This makes it impossible to model the staged process illustrated in Figure 2. In this process, an intermediate solution is generated in the form of a loosely-packed arrangement of rectangles describing crucial spatial relations between the primary elements that are to be allocated; the arrangement contains gaps or holes that are used later to allocate auxiliary spaces or that are added to previously allocated spaces once the shape of the circulation area has been determined.

Applications of this type suggest an expansion of the paradigm to include the generation of loosely-packed arrangements of rectangles. In this expanded form, the paradigm could also be applied to the layout of equipment and furniture and similar configurations that are by definition loosely-packed.

Up to now, the most important generalization of the paradigm has been described in [4], where various structures for representing the incidence relations between the line segments and faces of *connected rectilinear shapes* (among which the rectangular dissections form a proper subset) are presented. For the applications described above, however, connectivity has little importance; primary focus is on spaces (or on the areas occupied by the objects to be allocated) rather than the lines (or walls) that separate them. The following sections indicate a distinct second direction for generalizing the results obtained for rectangular dissections.

2 Orthogonal Structures

The rectangles to be dealt with in the following are always assumed to have sides parallel to the axes of an orthogonal system of Cartesian coordinates with a horizontal x- and a vertical y-axis. Any rectangle, r , is then completely described by the coordinates of its lower left corner, (x_r, y_r) and by the coordinates of its upper right corner, (X_r, Y_r) , where obviously

$$x_r < X_r \text{ and } y_r < Y_r \quad \text{d)}$$

The spatial relations *above*, *below*, *to the left* and *to the right* are defined on the set of rectangles as follows: If c and z are two rectangles,

$$c \wedge z \text{ (read } c \text{ is above } z) \Leftrightarrow y_c \geq Y_z \quad (2)$$

$$z \wedge c \text{ (read } z \text{ is below } c) \Leftrightarrow y_z \geq Y_c \quad (3)$$

$$c \rightarrow z \text{ (read } c \text{ is to the left of } z) \Leftrightarrow X_c \leq x_z \quad (4)$$

$$z \rightarrow c \text{ (read } z \text{ is to the right of } c) \Leftrightarrow X_z \leq x_c \quad (5)$$

Obviously, each of these relations is non-symmetric, non-reflexive and transitive, c and z do not overlap if at least one of the relations (2) to (5) holds between them.

Suppose z_1, \dots, z_n are n rectangles no two of which overlap. The *enclosing rectangle*, Z , is the minimum rectangle containing every rectangle z_i , $i = 1, \dots, n$. Z always exists and is uniquely determined. In the following, its upper, lower, left-hand and right-hand sides are always assumed to be bordered by four exterior rectangles labelled, respectively, N, S, W and E as shown in Figure 3. In contrast, the rectangles z_i are called *interior*. A set of n interior and four exterior rectangles, L is called a *loosely-packed arrangement of rectangles*. Figure 3 shows the interior and exterior rectangles of a loosely-packed arrangement of rectangles L_4 .

Loosely-packed arrangements of rectangles can describe various types of layouts: building parts on a floor; spaces or rooms on a floor; and equipment or furniture in a room. These arrangements are subject to various dependent and independent constraints restricting the shape of the objects to be allocated and their relations to each other and the surrounding context. The dependent constraints can be formulated (for example, through a system of simultaneous equations and inequalities in the corner coordinates of the rectangles) provided that for each pair of rectangles, at least one of the spatial relations (2) to (5) has been defined. This observation suggests an expansion of the present paradigm based on the spatial relations defined above.

These spatial relations cannot be selected independent of each other. For example, if a , b and c are three

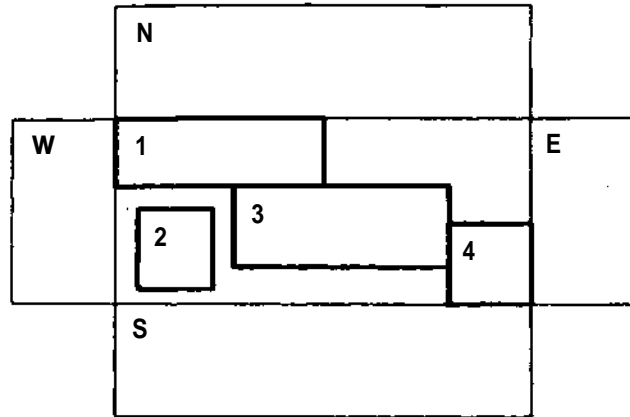


Figure 3: A loosely packed arrangement of rectangles L_4

rectangles so that $a \rightarrow b$ and $b \rightarrow c$, then $c \rightarrow a$ is impossible. In order to select, for /; given rectangles spjiul relations that can be *simultaneously realized*, a simple directed graph, $(\mathcal{I}, \rightarrow)$, is used. Its vertex set contains exactly // interior vertices and four exterior vertices labelled N, S, W and E. Each arrow of G_n is colored in one of two colors, h and w called *horizontal* and *vertical* respectively.

The following terminology and notation are useful for subsequent developments. A path in $(\mathcal{I}, \rightarrow)$ is called *horizontal* iff every arrow on the path is horizontal; a *vertical path* is defined in an analogous way. If u, v, w are three vertices so that u and v are connected by a directed path, p_1 , and v and w are connected by a directed path, p_2 then p_1 and p_2 have the same direction iff v is either the starting vertex or the terminal vertex of both p_1 and p_2 . For two vertices, v and w , of G_n ,

$v \text{ A } w$ (read v is directly above w) $\Leftrightarrow G_n$ contains a vertical arrow pointing from w to v

$v \text{ B } w$ (read v is directly below w) $\Leftrightarrow G_n$ contains a vertical arrow pointing from v to w

$v \text{ L } w$ (read v is directly to the left of w) $\Leftrightarrow G_n$ contains a horizontal arrow pointing from v to w

$v \text{ R } w$ (read v is directly to the right of w) $\Leftrightarrow G_n$ contains a horizontal arrow pointing from w to v

Furthermore,

$v \text{ A } w$ (read v is above w) $\Leftrightarrow v \text{ A } W \text{ O } T$

G_n contains vertices $u_0 (= v), u_1, \dots, u_m (= w)$ so that for $i = 1, \dots, m$, $u_{i-1} \text{ A } u_i$

$v \text{ B } w$ (read v is below w) $\Leftrightarrow v \text{ B } W \text{ O } T$

G_n contains vertices $u_0 (= v), u_1, \dots, u_m (= w)$ so that for $i = 1, \dots, m$, $u_{i-1} \text{ B } u_i$

$v \text{ L } w$ (read v is to the left of w) $\Leftrightarrow v \text{ L } W \text{ O } T$

G_n contains vertices $u_0 (= v), u_1, \dots, u_m (= w)$ so that for $i = 1, \dots, m$, $u_{i-1} \rightarrow u_i$
 $v \rightarrow w$ (read v is to the right of w) $\Leftrightarrow v \rightarrow w$
 G_n contains vertices $w_0 (= v), w_1, \dots, w_m (= w)$ so that for $i = 1, \dots, m$, $w_{i-1} \rightarrow w_i$.

For any vertex v of G_n , $a(v)$, $b(v)$, $c(v)$ and $d(v)$ denote the number of vertices that are, respectively, directly above, directly below, directly to the left and directly to the right of v .

The graph G_n is an *orthogonal structure* iff it satisfies the following conditions:

For every pair of distinct vertices, v and w (given in that order),
 either $v \rightarrow w$ or $w \rightarrow v$ or $v \rightarrow w$ or $w \rightarrow v$. (5)

If $v \rightarrow w$, the arrow pointing from v to w is the only directed vertical path from v to w ;
 and if $v \rightarrow w$, the arrow pointing from v to w is the only directed horizontal path from v to w . (7)

For every interior vertex, v , $a(v) + b(v) + c(v) + d(v) = 4$. (8)

SBW, SBE, NAW and NE . (9)

The alternatives in condition (6) are, as stated, exclusive; that is, any two vertices in G_n are connected by a uniformly colored path whose direction and coloring are fixed for these two vertices.

An orthogonal structure, G_n , represents a loosely packed arrangement of rectangles, L_n , iff there exists a one-to-one correspondence, f , between the vertices of G_n and the rectangles of L_n mapping vertices v to $f(v)$ and w , respectively, on rectangles N, E, S and W so that for any two vertices, v and w , of G_n

$$v \rightarrow w \Rightarrow f(v) \rightarrow f(w) \text{ and } v \leftarrow w \Rightarrow f(v) \leftarrow f(w). \quad (10)$$

Figure 4 shows, as an example, an orthogonal structure, G_4 , and a loosely-packed arrangement of rectangles Z_4 , represented by G_4 .

Theorem 1: Every loosely-packed arrangement of rectangles, L_n , is represented by an orthogonal structure, G_n .

Proof: Any hole in L_n can be filled by additional rectangles none of which overlaps another rectangle in L_n or an added rectangle. The result is a rectangular dissection, L_n' , with n' interior components. L_n' can be treated formally as a T-plan or trivalent dissection [5]. From L_n' construct a directed, arrow-colored graph, G_n' , as follows. G_n' contains n' vertices corresponding to the interior rectangles of L_n' and four exterior vertices labelled N, S, W and E . G_n' contains a vertical arrow pointing from v to w iff the components corresponding to v and w border a horizontal wall or maximal line interval to the left and right, respectively. G_n' contains a horizontal arrow pointing from v to w iff the

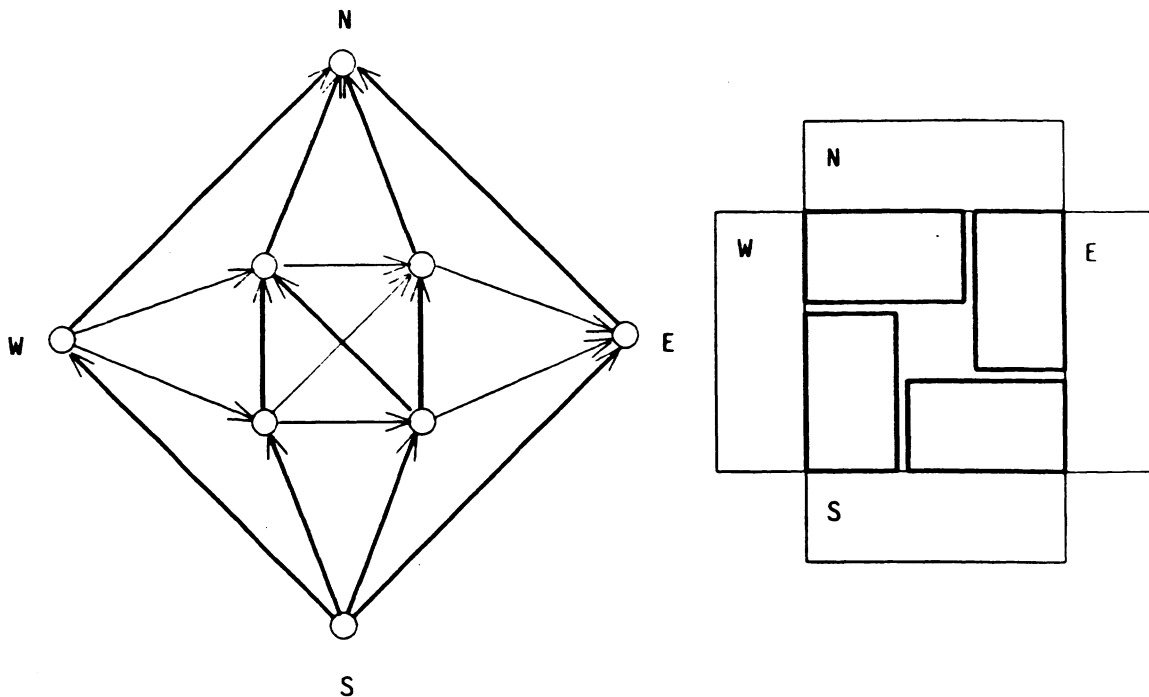


Figure 4: An orthogonal structure, G_4 , and a loosely packed arrangement of rectangles, L_4 , realizing G_4

components corresponding to v' and w' border a vertical maximal line from the left and right, respectively. Arrows are defined between pairs of exterior vertices according to (9). It follows from the Structure Theorem proved in [6] that the resulting graph, $G_{n'}$, satisfies (6) to (9).

Let now v be a vertex corresponding to a component not in L_n . For every pair of vertices a and b so that $aA v$ and $bB v$, insert a vertical arrow pointing from b to a iff a and b are not on a directed vertical path that avoids v . For every pair of vertices l and r so that $lL v$ and $rR v$, insert a vertical arrow pointing from l to r iff l and r are not on a directed horizontal path that avoids v . Remove v and all arrows incident with it. The resulting graph, $G_{n'-1}$, is an orthogonal structure. Repeating this reduction $n' - n$ times generates an orthogonal structure, G_n , representing L_n .

A trivalent dissection with exactly n interior components to which four suitable exterior components have been added is a special case of a loosely-packed arrangement of rectangles and will be denoted by D_n . An orthogonal structure constructed from such a dissection according to the process used in the proof of Theorem 1 is said to be *defined* by that dissection.

Theorem 2: Every orthogonal structure, G_n , represents a loosely packed arrangement of rectangles L_n .

Proof: By (8), every interior vertex, v , is on a directed vertical path from S to v . Define y_v as the length of the longest of these paths and $Y_v \equiv y_v + 1$. Similarly, v is on a directed horizontal path from W to v . Define x_v as the length of the longest of these paths and $X_v \equiv x_v + 1$. This gives the coordinates of n rectangles corresponding to the n interior vertices of G_n . Because of (6), no two

these rectangles overlap. Adding suitably selected exterior rectangles generates a loosely-packed arrangement of rectangles represented by (i_n) .

These theorems show that orthogonal structures are well-formed or syntactically correct representations of loosely-packed arrangements of rectangles. They can form the basis for a generator which determines, according to the current paradigm, various sets of realizable spatial relations between pairs of rectangles. If used in this way, orthogonal structures have intuitive appeal to me mainly for two reasons. They demonstrate, first of all the possibility of finding a useful structure in non-connected arrangements which do not appear amenable, at least at first sight, to the approach that has successfully been applied to connected shapes. I also find the conditions that determine the well-formedness of these structures particularly easy to understand.

However, a note of caution must be added here. The orthogonal structure representing a loosely-packed arrangement of rectangles is not necessarily uniquely determined because certain pairs of spatial relations can hold simultaneously between two rectangles, while an orthogonal structure records only one of these relations. This problem can theoretically be resolved in two ways: (a) rules can be established under which a uniquely determined *canonical* representation is selected for any arrangement; or (b) orthogonal structures can be *refined* so that they become able to distinguish cases in which only one relation holds between two rectangles from those in which two relations hold.

None of these approaches is pursued here. For the experience with the densely-packed case, in which an analogous problem occurs, suggests that the practical implications of this problem are negligible: as a result, the theoretical and computational complications resulting from approaches (a) or (b) become decidedly unattractive. The final judgement with respect to this situation must, however, be suspended until more experience has been gained with the present approach.

In order to develop an efficient generator, a closer look at the implications of conditions (6) to (9) is in order.

Lemma 3: Let w , v and u be three vertices in an orthogonal structure, $\langle \mathcal{T}_m \rangle$ so that u and v are on a directed horizontal path, p and w and v are on a directed vertical path, p_i . Then u and v are either on a directed horizontal path whose direction is the same as for p or on a directed vertical path whose direction is the same as for p_i .

Proof: Suppose $v \times u$ and $v \succ u$ (see Figure 5). By (6), $w \succ v$, and therefore $w \succ u$. Similarly, $u \succ v$, and therefore $u \succ w$. Thus, either $w \succ u$ or $u \succ w$. The other cases indicated in Figure 5 can be proved analogously.

Clearly, orthogonal structures are non-planar in the general case. They thus do not possess one of the important attributes shared by the structures used in [4] to represent various properties of connected

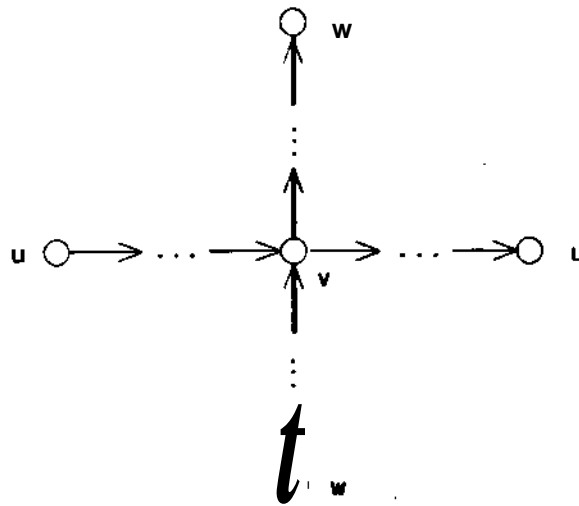


Figure 5: Lemma 3 - Illustration

rectilinear shapes. The following lemma shows, however, that orthogonal structures imply a total ordering on the arrows incident with a vertex.

Lemma 4: Let v be a vertex in an orthogonal structure.

(i) If $a(v) > 1$, the vertices directly above v form a sequence $a_{v_1}, \dots, a_{v_{a(v)-1}}, a_{v, a(v)}$ so that $r_i = a_{v_i}$.

(ii) If $b(v) > 1$, the vertices directly below v form a sequence $b_{v_1}, \dots, b_{v_{b(v)-1}}, b_{v, b(v)}$ so that $r_i = b_{v_i}$.

(iii) If $X(v) > 1$, the vertices directly to the left of v form a sequence $X_{v_1}, \dots, X_{v_{X(v)-1}}, X_{v, X(v)}$ so that $r_i = X_{v_i}$.

(iv) If $p(v) > 1$, the vertices directly to the right of v form a sequence $p_{v_1}, \dots, p_{v_{p(v)-1}}, p_{v, p(v)}$ so that $r_i = p_{v_i}$.

Proof: (i). Suppose $a(v) > 1$, and let a and a^x be any two distinct vertices directly above v . It follows that a^x is above a and a is above v . Thus, either a^x is above a or a is above a^x . The vertices directly above v therefore form a sequence $a_{v_1}, \dots, a_{v_{a(v)-1}}, a_{v, a(v)}$ so that a_{v_i} is above $a_{v_{i-1}}$, $i=1, \dots, a(v)-1$.

Suppose that for some K $1 < h < a(v)$, a_{v_h} is above $a_{v_{h+1}}$. Then there exists a vertex z so that z is above a_{v_h} and z is below $a_{v_{h+1}}$ since otherwise, a_{v_h} is above $a_{v_{h+1}}$. By Lemma 3 then, z is above a_{v_h} . But z is below $a_{v_{h+1}}$ consequently, there exists a vertex $a_{v_h'}$ so that $a_{v_h'}$ is above z and z is above $a_{v_{h+1}}$, or z is above $a_{v_{h+1}}$ (by Lemma 3) which is impossible. If z is above $a_{v_{h+1}}$, z is above $a_{v_{h+1}}$ or z is above $a_{v_{h+1}}$, which is again impossible. z cannot exist, and a_{v_i} is above $a_{v_{i+1}}$.

Statements (ii), (iii) and (iv) can be proved analogously.

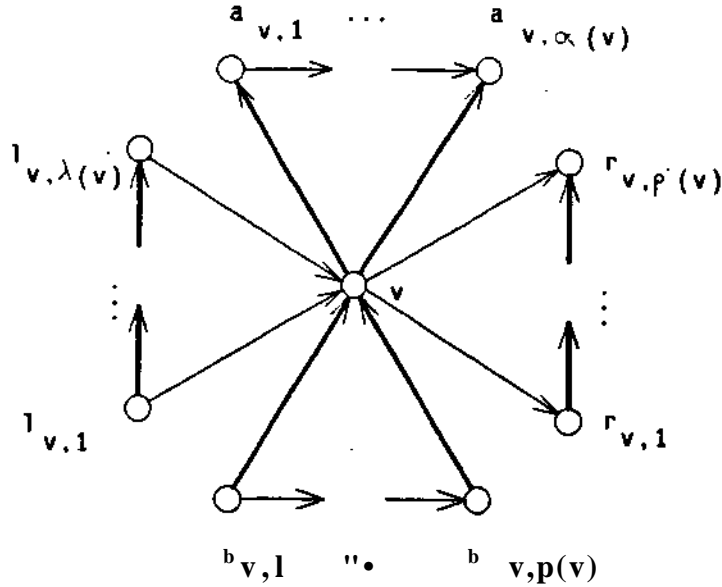


Figure 6: Lemma 4 - Illustration

The notation introduced in Lemma 4 and illustrated in Figure 6 will be used repeatedly in this and the following section; that is, if v is a vertex in an orthogonal structure, $a_{v,i}$ and $l_{v,i}$ denote, respectively, the first and last vertex directly above v ; $b_{v,i}$ and $r_{v,i}$ denote, respectively, the first and last vertex directly below v ; and finally, $l_{v,\lambda(v)}$ and $r_{v,p(v)}$ denote, respectively, the first and last vertex directly to the left and right of v .

Lemma 5: Let v be a vertex in an orthogonal structure.

$$(i) \quad a_{v,1} \text{ or } a_{v,\alpha(v)}$$

$$(ii) \quad r_{v,p(v)} \text{ or } r_{v,1}$$

$$(iii) \quad l_{v,\lambda(v)} \text{ or } l_{v,1}$$

$$(iv) \quad b_{v,1} \text{ or } b_{v,p(v)}$$

Proof: (i). By Lemma 3, either $l_{v,\lambda(v)} = l_{v,1}$ or $l_{v,\lambda(v)} = l_{v,\alpha(v)}$. Suppose $l_{v,\lambda(v)} = l_{v,1}$. Then there exists a vertex z so that $z = l_{v,\lambda(v)}$ and $z = l_{v,\alpha(v)}$ by Lemma 4 then, $z = l_{v,1}$. But then $z = l_{v,1}$ for some $l < \lambda(v)$. By Lemma 3, either $z = l_{v,1}$ or $z = l_{v,\lambda(v)}$ which is impossible, z therefore cannot exist, and $l_{v,\lambda(v)} = l_{v,\alpha(v)}$.

The case where $a_{v,i} = l_{v,\alpha(v)}$ as well as statements (ii) to (iv) can be proved in an analogous manner.

Lemma 6: Let v be a vertex in an orthogonal structure.

(i) If $r_{v,1} \in R_{v,\lambda(v)}$ and $r_{v,1} \in R_{v,1}$ and $r_{v,1} \in R_{v,1}$ and $r_{v,1} \in R_{v,1}$

then $wLv < > ivLa_{v,1}$ and $v = b_{v,1} (H \setminus K = > HA_{v>A(v)} \text{ and } r = r_{v,A(v),p</v,X(v)}]$.

(ii) If $r_{v,p(i)} \in R_{v,a(v)}$ and $r_{v,p(i)} \in R_{v,p(i)}$ and $r_{v,p(i)} \in R_{v,p(i)}$ and $r_{v,p(i)} \in R_{v,p(i)}$

then $w|v < > w|r_{v,p(i)} dn < i \quad v = l_{r_{v,p(i)}} Mr_{v>p(v)}$

$[wRv < > wRa_{v,\alpha(v)}$ and $v = b_{a_{v,\alpha(v)},\beta(a_{v,\alpha(v)})}]$.

(iii) If $b_{v,p(i)} \in L_{v,1}$ and $b_{v,p(i)} \in L_{v,1}$ and $b_{v,p(i)} \in L_{v,1}$ and $b_{v,p(i)} \in L_{v,1}$

then $vRv < > ivR6_{v,1}$ and $v = a_{(v),1} (6_{v,w,v}) I^{\wedge} Bv < > wBr_{v,1}$ and $v = l_{r_{v,1},1}$.

(iv) If $r_{v,j} \in A_{v,1}$ and $r_{v,j} \in A_{v,1}$ and $r_{v,j} \in A_{v,1}$ and $r_{v,j} \in A_{v,1}$

then $wBv < > wB_{v,i}$ and $v = r_{v,1} j [H Lv < > vLi_{v,j}$ and $v = a_{v,1}^{\wedge}]$.

Proof: Case (i). Let $r_{v,1} \in R_{v,1}$ and $r_{v,1} \in R_{v,1}$. Suppose there exists a vertex z such that $z \in R_{v,1}$ and $z \in R_{v,1}$. By Lemma 3 then, $z \in R_{v,1}$. Then there exists a horizontal path from v to z longer than one, which is impossible. Therefore, $v \in R_{v,1}$. Furthermore, $v \in R_{v,1}$ and consequently, $v \in R_{v,1}$.

Suppose there exists a vertex z' so that $z' \in R_{v,1}$ but $z' \notin R_{v,1}$ and there exists a directed vertical path, which is longer than one, from v to z' and consequently from v to z' . Since $v \in R_{v,1}$ is impossible, $v \in R_{v,1}$.

The other cases can be proved analogously.

The four cases distinguished in Lemma 6 represent the spatial relations between a component corresponding to v and various other components that border a maximal line in a rectangular dissection. The corresponding configurations of components and lines are shown in Figure 7 (in this and some of the following figures the rectangle corresponding to a vertex is identified, for the sake of simplicity, by the label of that vertex). This observation motivates the following definition.

An orthogonal structure, G_n is dense iff for every vertex v in G_n vertices $q_{v,1}$ and $r_{v,1}$ satisfy the premise of case (i), vertices $r_{v,p(i)}$ and $r_{v,p(i)}$ satisfy the premise of case (ii), vertices $r_{v,1}$ and $b_{v,1}$ satisfy the premise of case (iii) and vertices $b_{v,i}$ and $r_{v,i}$ satisfy the premise of case (iv) in Lemma 6.

Lemma 7: An orthogonal structure, G_n is dense iff it is defined by a dissection D_n .

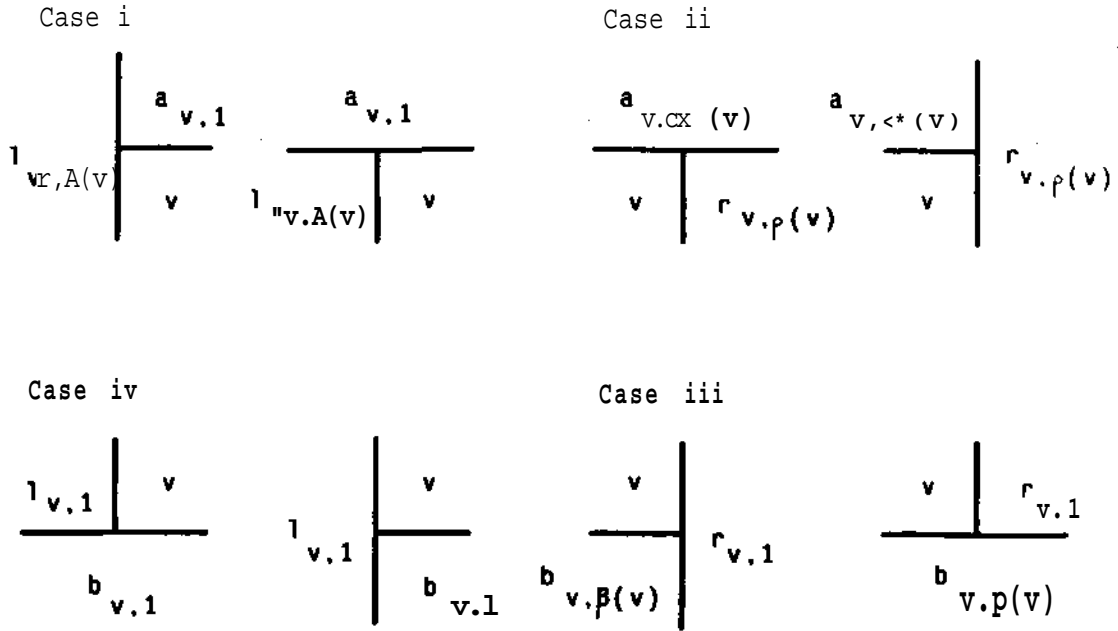


Figure 7: Lemma 6 - Illustration

Proof: Necessity. If G_n is defined by a dissection D_n it is obviously dense.

Sufficiency. The proof is by induction on n using operations 'in the upper left corner' as known from the literature. For $n=1$, there exists only one orthogonal structure, G_1 , which is defined by a rectangular dissection, D_1 and dense. Suppose that for some $n \geq 1$, every dense orthogonal structure with n (≤ 7) interior vertices is defined by a trivalent rectangular dissection D_n . Let $(G, <)$ be an arbitrary dense orthogonal structure with $n+1$ interior vertices. Clearly, $r_w \wedge r_{v-}$ denote this vertex by c . Since $n > 1$, $b_{c p(c)}$ or $r_{c,1}$ must be interior, and since G is dense j vertices directly below c are precisely the vertices directly below $r_{c,1}$ or the vertices directly right of c are precisely the vertices directly to the right of $r_{c,1}$. The resulting two cases are shown in Figure 8. Contracting, in case 1, the arrow pointing from W to c or, in case 2, the arrow from c to N creates a dense orthogonal structure, G_n , as shown in Figure 8. By hypothesis, G_n is defined by a dissection D_n . The configurations at the upper left corner shown for each case in Figure 9. Adding a component at the upper left corner as shown in the same figure generates a dissection D_{n+1} defining G_{n+1} .

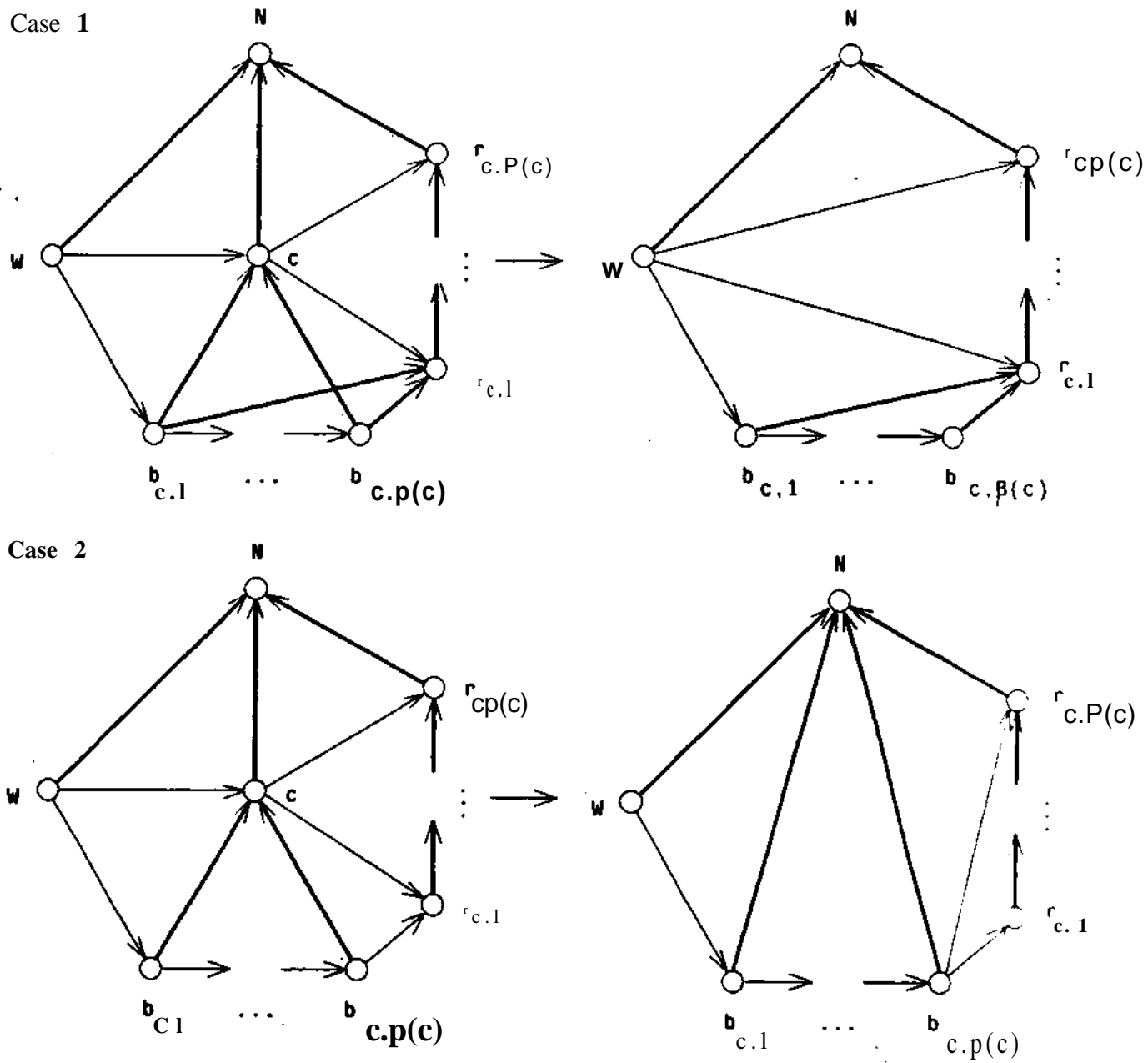


Figure 8: Lemma 7 - Transition from G_{n+1} to G_n

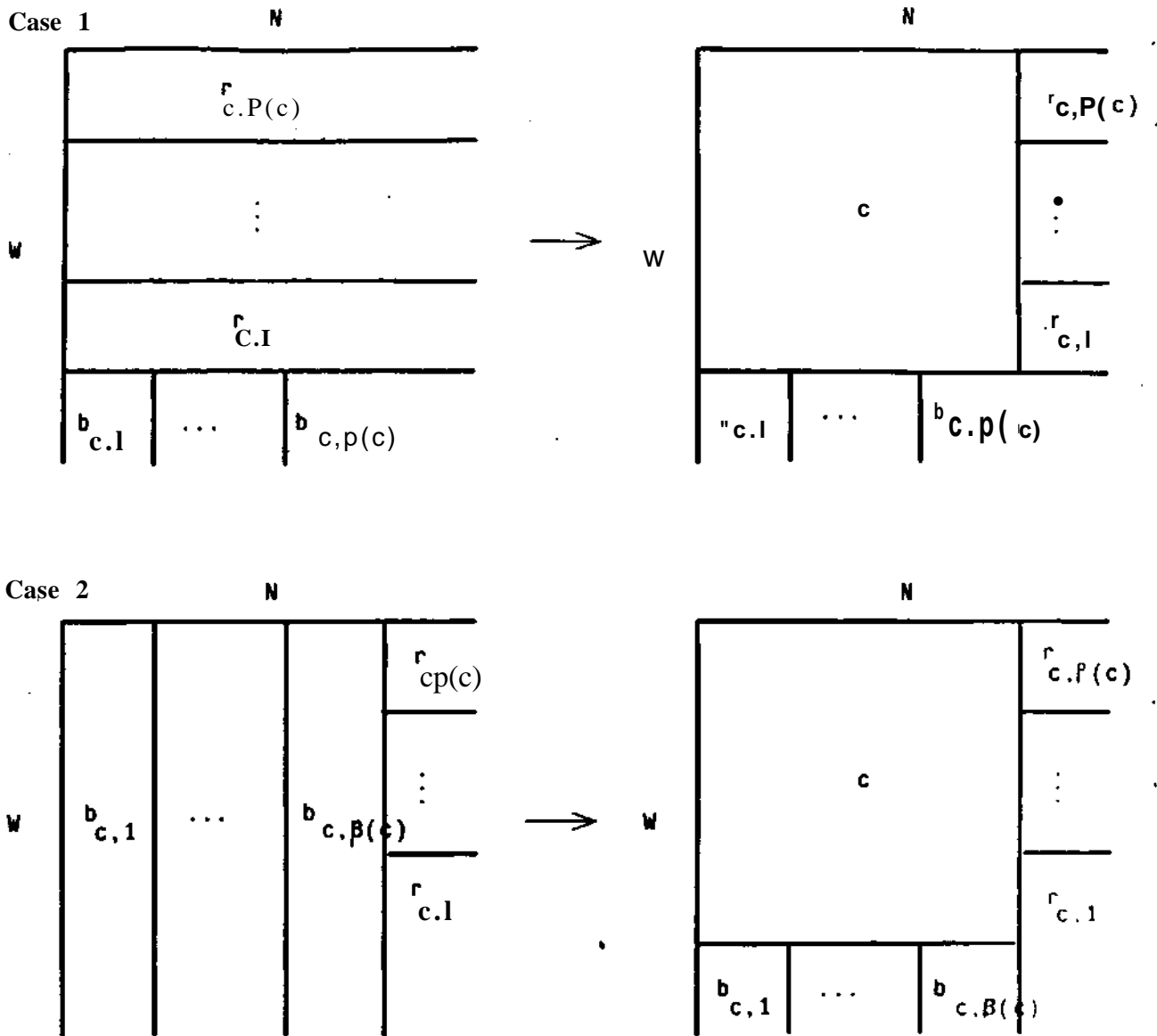


Figure 9: Lemma 7 - Transition from $D_n \setminus \{oD_n+\}$

3 Generation of Orthogonal Structures

Let I_n be a loosely-packed arrangement of rectangles. A hole in I_n is *trivial* iff it can be eliminated by extending selected sides of certain rectangles in I_n parallel to the coordinate axes (without creating overlaps between pairs of rectangles). If every hole in I_n is trivial, I_n can be generated from a dissection D_n by reversing this process and by reducing the sides of certain components. Thus, if every hole in a loosely-packed arrangement of rectangles were trivial, the procedures developed for the generation of rectangular dissections could be used without major modifications for the generation of loosely-packed arrangements of rectangles.

This is, however, not the case. For example, the loosely-packed arrangement of rectangles, L_4 , shown in Figure 4 contains a non-trivial hole, and the orthogonal structure representing L_4 consequently is not dense. It is, furthermore, easy to see that the only non-trivial holes that can occur in a loosely-packed arrangement of rectangles (after all trivial holes have been eliminated) are surrounded by four rectangles forming a pinwheel turning clockwise (as shown in Figure 4) or counterclockwise. The cases in which the premises of Lemma 6 are not met are standardized in the following and used to represent the spatial relations between rectangles forming precisely these types of non-trivial holes.

Note, at the outset, that if for a vertex, v , $a_{v,1} \mathbf{R}l_{v,\lambda(v)}$ but also $a_{v,1} \mathbf{a}l_{v,1}$, then $a_{v,1} \mathbf{A}l_{v,k}$ for some unique $k (< \lambda(v))$ and $a_{v,1} \mathbf{R}l_{v,k'}$ for $k' = k + 1, \dots, \lambda(v)$; similarly, if $l_{v,\lambda(v)} \mathbf{B}a_{v,1}$ but also $l_{v,\lambda(v)} \mathbf{r} a_{v,\alpha(v)}$, then $l_{v,\lambda(v)} \mathbf{R}a_{v,h}$ for some unique $h (> 1)$ and $l_{v,\lambda(v)} \mathbf{B}a_{v,h'}$ for $h' = 1, \dots, h - 1$. Analogous results can be obtained if the premises of cases (ii) to (iv) in Lemma 6 are not satisfied.

An orthogonal structure is *restricted* iff it satisfies the following conditions for all vertices v .

$$\begin{aligned}
 & \text{If } a_{v,1} \mathbf{R}l_{v,\lambda(v)} \text{ and } a_{v,1} \mathbf{A}l_{v,k} \text{ for some } k (< \lambda(v)) \\
 & [l_{v,\lambda(v)} \mathbf{B}a_{v,1} \text{ and } l_{v,\lambda(v)} \mathbf{L}a_{v,h} \text{ for some } h (> 1)] \\
 & \text{then } w \mathbf{L}a_{v,1} \wedge u \mathbf{R}l_{v,k} \Rightarrow w \mathbf{L}u \text{ and } w \mathbf{A}v \wedge u \mathbf{B}l_{v,k+1} \Rightarrow w \mathbf{A}u \\
 & [w \mathbf{A}l_{v,\lambda(v)} \wedge u \mathbf{B}a_{v,h} \Rightarrow w \mathbf{A}u \text{ and } w \mathbf{L}v \wedge u \mathbf{R}a_{v,h-1} \Rightarrow w \mathbf{L}u].
 \end{aligned} \tag{11}$$

Under condition (11), the spatial relations among the rectangle corresponding to vertex v , $f(v)$, and the other rectangles surrounding a non-trivial hole at the upper left corner of $f(v)$ are defined according to the construction used in the proof of Theorem 1 (see Figure 10). The first part of (11) describes rectangles forming a pinwheel that turns counterclockwise, while the second part describes rectangles forming a pinwheel that turns clockwise. Based on this observation, the following theorem is easy to prove.

Theorem 8: Every loosely-packed arrangement of rectangles, I_n , is represented by a restricted orthogonal structure, G_n .

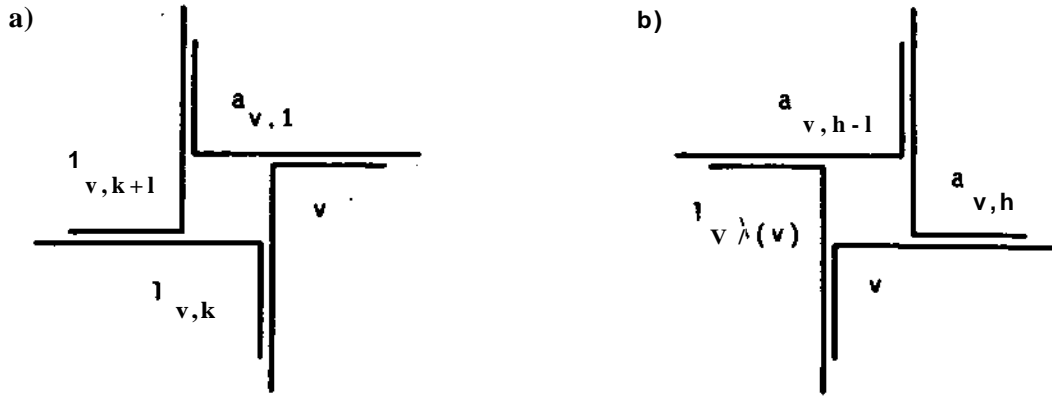


Figure 10: Condition (11) - Illustration

To select vertex v as a reference in the formulation of condition (11) was an arbitrary choice. The following lemma shows that each of the other three vertices representing a rectangle involved in the formation of a non-trivial hole could have been used.

Lemma 9: Each of the the following conditions is equivalent to (11).

$$\begin{aligned}
 & \text{If } r_{v,p(v)}^B \wedge v, a < v \text{ and } r_{v,p(v)}^{an} < * r_{v,p(v)} \text{Ra}_{v,b} \text{ for some } h (< a(v)) \\
 & k a(v) k p(v) \text{ and } a_{v,a(v)} \text{Ar}_{v,l} \text{ for some } l (< p(v)), \\
 & \text{then } w | r_{v,p(v)} \text{AuBa}_{v,i} \Rightarrow wAw \text{ and } wRvA wLa_{v,h-1} \Rightarrow H > RW \\
 & [wRa_{v,a} \wedge AuLr_{v,i} \Rightarrow vLwand wAvA uBr_{v,i} \Rightarrow w|u].
 \end{aligned} \tag{12}$$

$$\begin{aligned}
 & \text{If } 6_{v,0(v)} Lr_{v,j} \text{ and } 6_{v,\xi(v)} Br_{v,i} \text{ for some } l (> 1) \\
 & K 1^{A6_{v,3(v)}} r_{v,i} R6_{v,y} \text{ for some } y (< \xi(v)), \\
 & \text{then } H' Rft_{v,\xi(v)} A wLr_{v,\gamma} \Rightarrow n/Rwand vBvA wAr_{v,i-1} \Rightarrow wBu \\
 & [> vBr_{v,j} Au|b_j \Rightarrow wBwand > vRvA wL6_{v,\gamma+1} \Rightarrow wRu].
 \end{aligned}$$

$$\begin{aligned}
 & \text{If } l_{v,1} | b_{v,i} \text{ and } l_{v,i} Lb_j \text{ for some } y (> 1) \\
 & [b_{v,i} R|_{v,i} \text{ and } 6_{v,i} B|_{v,\wedge} \text{ for some } k (> 1)], \\
 & \text{then } H > B|_{v,i} Au|b_j \Rightarrow wBwand wLvA uRb_{v,i-1} \Rightarrow > vLw \\
 & [wLb_{v,1} \wedge uR|_{v,k} \Rightarrow wLu \text{ and } wBv \wedge uA|_{v,k-1} \Rightarrow wBu].
 \end{aligned}$$

Proof: (11) \Rightarrow (14). $LciG_n$ be an orthogonal structure so that (11) holds for every vertex of $\langle \rangle$. Let furthermore v' be a vertex of G_n so that $|| i A/y. |$ and $|| | i / \wedge$ for some $l (> 1)$. IVP. \bullet , $b_j i$ by v . Suppose $l_{v,X(v)} B < l_{v,y}$. If $l_{v,u} B t_{v,a < v}$. Then $y / \wedge / v. A(v)$ ($h >$ Lemma 6) and connected to $6 / , / - i$ by a vertical path longer than one, which is impossible. If $l_{v,i} | (v) <$ some then $a, i = v'$ or $fl \wedge / r^7$. $U_v (11)$. $H' LVAWR (/ v , .] \Rightarrow K1W$. Consequently, $b_{v,j} | v'$ whk again impossible. Thus, $l_{v,A} v) B (/ v , j$. and by Lemma 5. $tf_{v,i} R / v. X (\triangleright$ furthermore, $v \wedge i /$, K. (11) then.

$$w | v' \wedge u R b_{v',j-1} \Rightarrow w | u \text{ and } u \wedge b_{v',1} \wedge w B | v', 1 \Rightarrow w Bu.$$

(14) =>(13). (13) =>(12) and (12) =>(11) can be proved analogously.

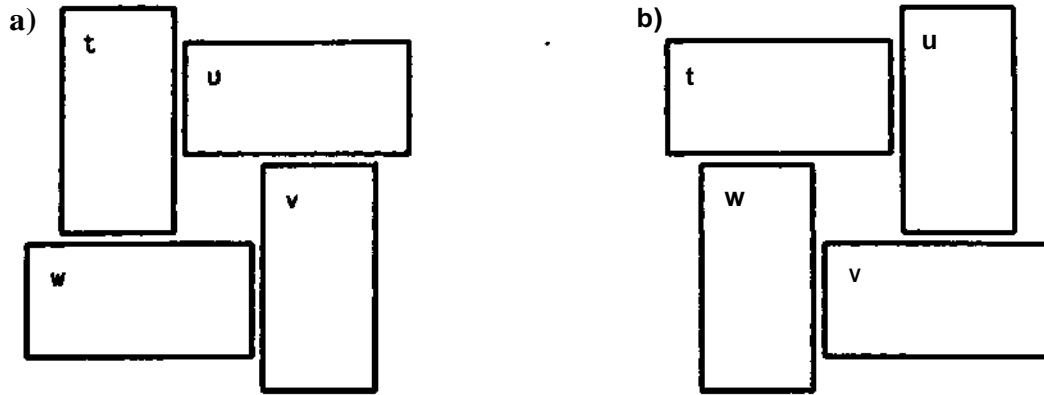


Figure 11: Rectangles forming a pinwheel turning a) clockwise and b) counterclockwise

Let L_n be a loosely-packed arrangement of rectangles and G_n a restricted orthogonal structure representing G_n . Suppose t, u, v and w are vertices in G_n representing four rectangles in L_n that form a pinwheel around a non-trivial hole. If the pinwheel turns counterclockwise (see Figure 11 a).

$$t = l_{u,1}, u = a_{v,1}, v = r_{w,\beta(w)} \text{ and } w = b_{t,\beta(t)}$$

Furthermore,

$$a_{v,\alpha(v)} = a_{w,\alpha(w)}, b_{t,1} = b_{u,1}, l_{u,\lambda(u)} = KM(v) \text{ and } r_{w,1} = r_{u,1}$$

If the pinwheel turns clockwise (see Figure 11 b),

$$t = a_{w,\alpha(w)}, u = r_{t,1}, v = b_{u,1} \text{ and } w = l_{v,\lambda(v)}$$

and

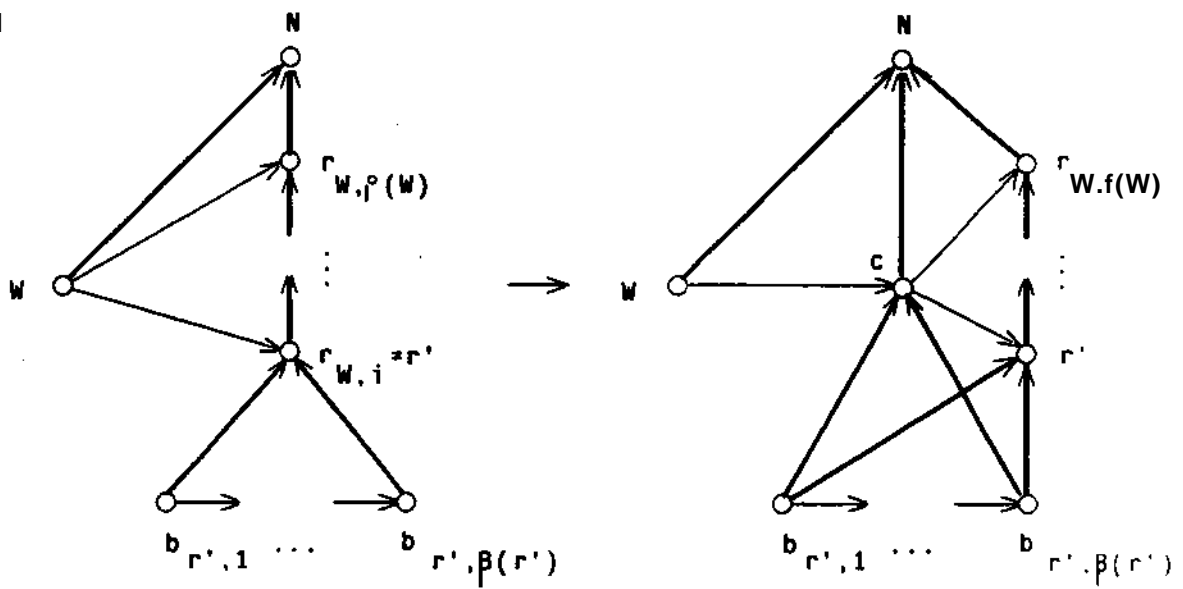
$$a_{w,1} = a_{v,1}, b_{u,\beta(u)} = b_{t,\beta(t)}, l_{v,1} = l_{u,1} \text{ and } r_{t,\rho(t)} = r_{v,\rho(v)}$$

These observations show that (11) standardizes the spatial relations holding among rectangles in the neighborhood of a non-trivial hole in a natural and - more importantly - predictable way. This proves extremely useful during the development of a generator for restricted orthogonal structures.

For the present context, two types of generators are of interest: (a) those that enumerate all non-isomorphic restricted orthogonal structures G_n for a given n ; and (b) those that also distinguish for a given G_n differences created by different assignments of labels to the internal vertices of G_n . The first type of procedure is interesting for theoretical purposes, while the second type is important mainly for practical applications where labels are used to distinguish different functional units. The present paper concentrates on the generation of non-isomorphic orthogonal structures and presents a grammar that can be used to this end.

Figure 12 shows the rules of the grammar. Each mlc is a recursive re-write rule consisting of a left-hand and a right-hand side both of which are parameterized. A rule can be applied to a restricted orthogonal structure G_n iff there exists an assignment of values to the parameters of its left-hand side under which this side becomes a subgraph of G_n . The application itself produces a directed graph G_{n+j} by substituting the right-hand side of the rule (under the same assignment of values) for its left-hand side in G_n . The grammar is complete by adding as an initial configuration the orthogonal structure (7) which is dense (and therefore restricted).

Rule 1



Rule 2

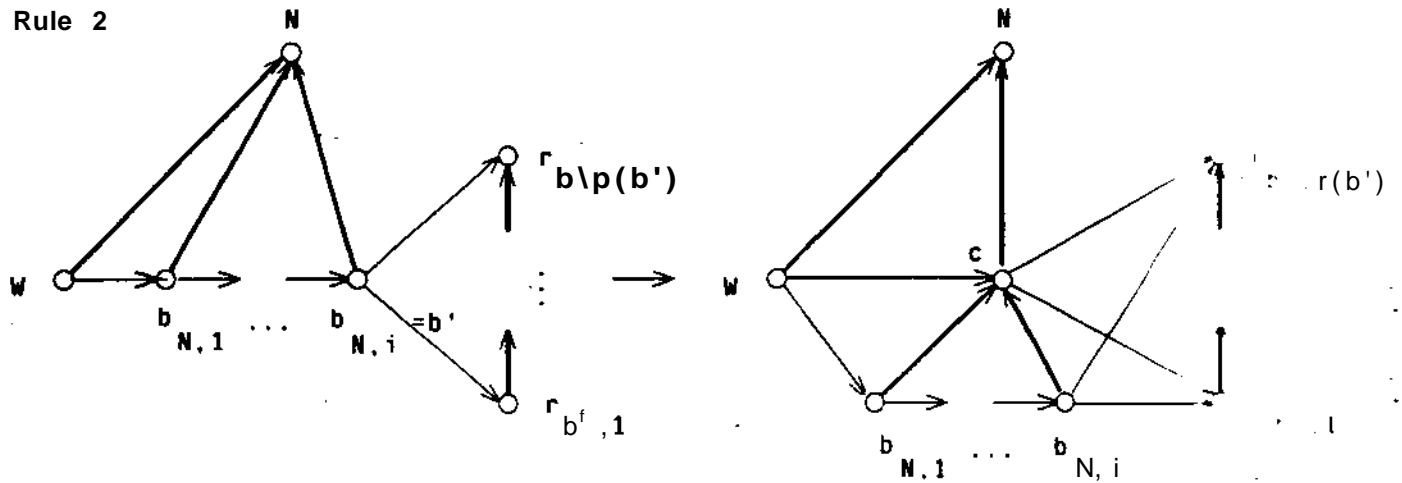
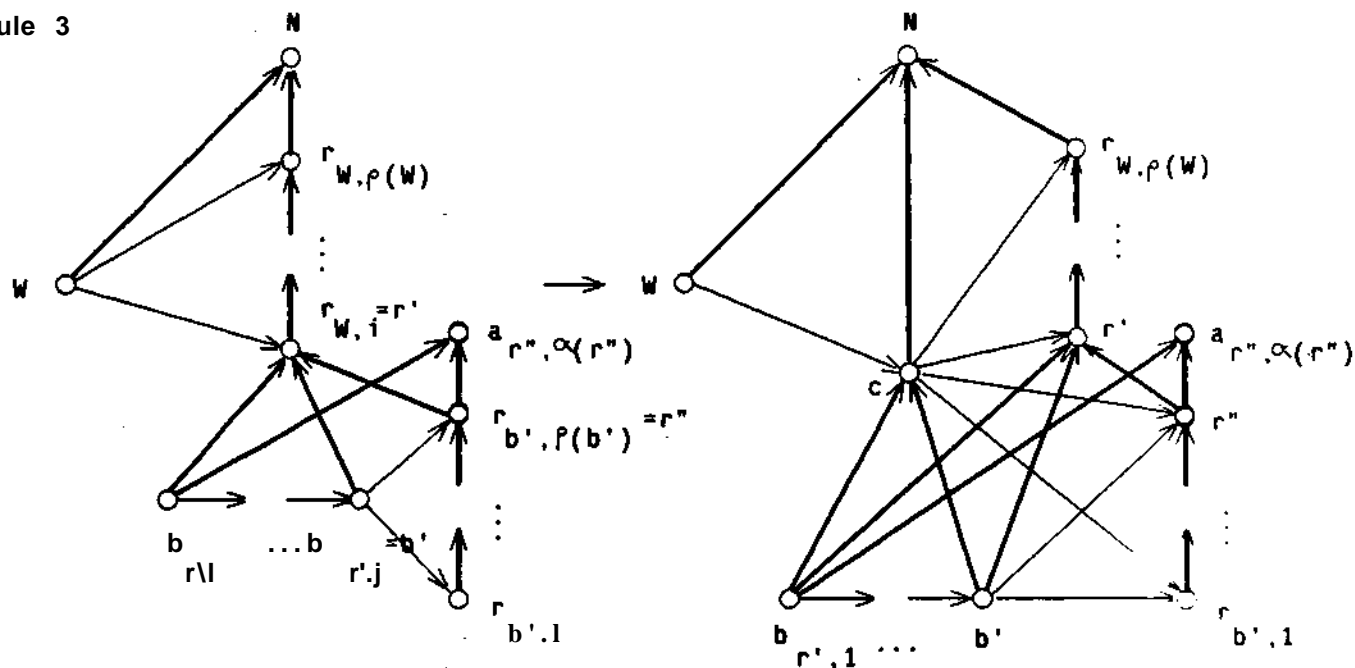


Figure 12: Rules 1 and 2

All rules follow the basic approach that has been used before in a similar context: vertices are inserted

Rule 3



Rule 4

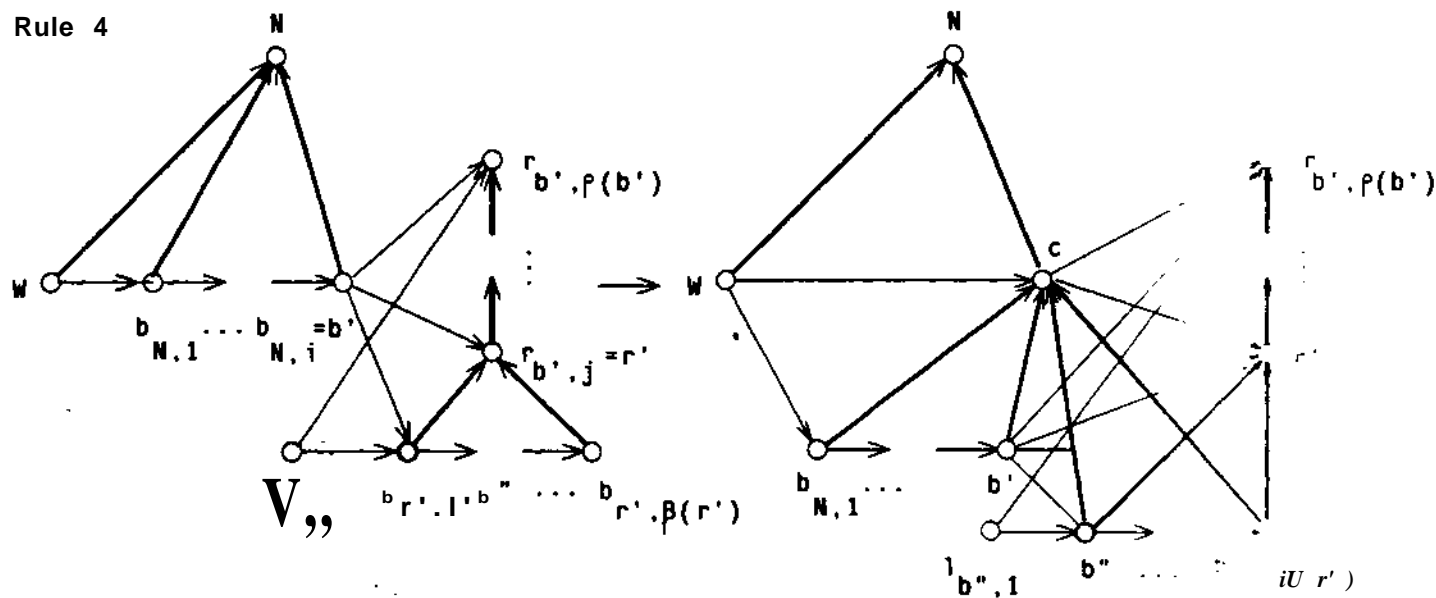


Figure 12 (continued) - Rules 3 and 4

upper left corner*, which makes it particularly easy to avoid duplication of isomorphic structures (Corollary 12). Rules 1 and 2 generate only dense structures, while rules 3 and 4 generate sparse structures representing arrangements with non-trivial holes. The hole always occurs at the lower right corner of the rectangle corresponding to vertex i ; it turns counterclockwise in case of rule 3 and clockwise in case of rule 4. A geometric interpretation of the application of rules 1 to 4 is shown in Figure 13.

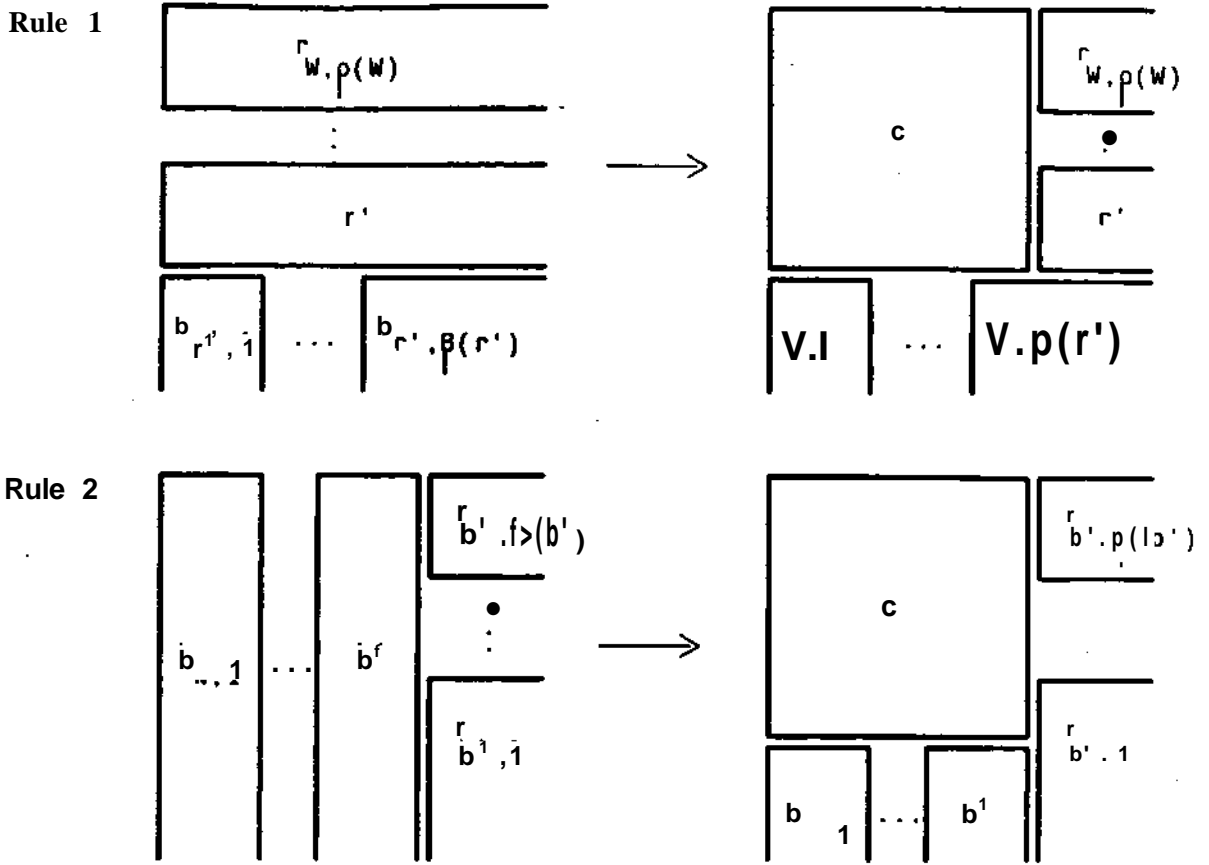


Figure 13: Rules 1 and 2 - geometric interpretation

Theorem 10: (Closure) If G_n is generated from G_l through a series of applications of rules 1 and 2, then G_n is a restricted orthogonal structure.

Proof: Only rules 1 and 2 are applicable to G_n ; they produce the two non-isomorphic restricted orthogonal structures shown in Figure 14.

Suppose G_n is a restricted orthogonal structure to which rule 3 is applicable, generating a structure G_{n+1} . Observe that W is the only vertex directly to the left of vertex c and N is the only vertex directly above c . For every vertex z so that zbc , zbb' or zW . For every vertex z' so that $z'c$, $z'aZ'$ or $z'xb'$. Thus, (6) is satisfied for c and any other vertex of G_{n+1} . The condition also holds for all other pairs of vertices.

Suppose $(i_n, +j)$ contains an v -colored arrow pointing from a to b and a directed, v -colored path from a to b longer than one. Since (i_n) is an orthogonal structure, A or P cannot be in (i_n) . Consequently, either a or b is the vertex c . But the construction of G_{n+1} from the orthogonal structure G_n assures that if c is connected to another vertex by an arrow, it is not connected to that vertex by a directed, uniformly-colored path longer than one. Thus, $(i_n, +j)$ satisfies (8) and obviously satisfies (S) and (9). $(i_n, +j)$ therefore is a restricted orthogonal structure.

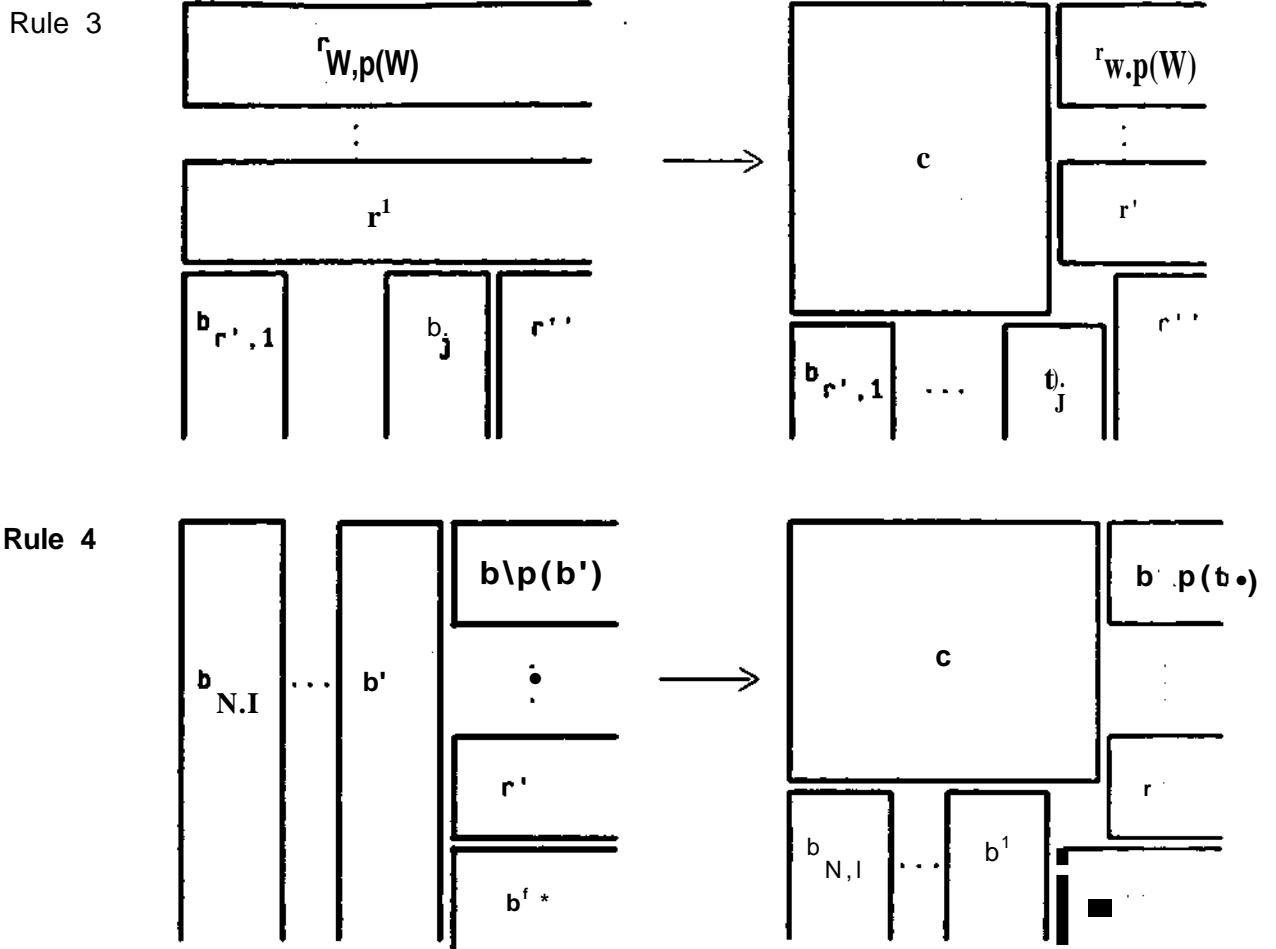


Figure 13 (continued): Rules 3 and 4 - geometric interpretation

Observe that if u is a vertex in $(\gamma, +)$ not incident with c the vertices incident with u remain unchanged in the transition from G_n to G_{n+1} and u satisfies (11). Any vertex $v \in c$, b/j , $r_{w,j} < j < i > i$ cannot satisfy the premise of (11).

Consider vertex r'' . In G_{n+1} , $u \rightarrow i(\sim r')RI_{r''} \wedge \{^c\}$ and $a'_{i|l_{r''}} (= b')$. $v \in c$, b/j , $r_{w,j} < j < i > i$. Thus, r'' satisfies the premise of (11). By construction, $uRI_{r''} = > cLu$, and $MFK_{r''}$ is the only vertex directly to the left of $a'_{i|l_{r''}}$.

$$wLa_{r''} u_j A uKI_{f_k} \Rightarrow wLu.$$

Furthermore, $b/1 B < ; /_{a(r'')}$ and consequently, $wAr'' = > w \setminus b/ji$ for $i = 1 \dots /$. By construction, $u|a_{r''} = > u|c \setminus = L_{r''} A + j$. Thus,

$$w \setminus r'' A u RI_{r''} i_{k+1} = > wAw,$$

and r'' satisfies (11).

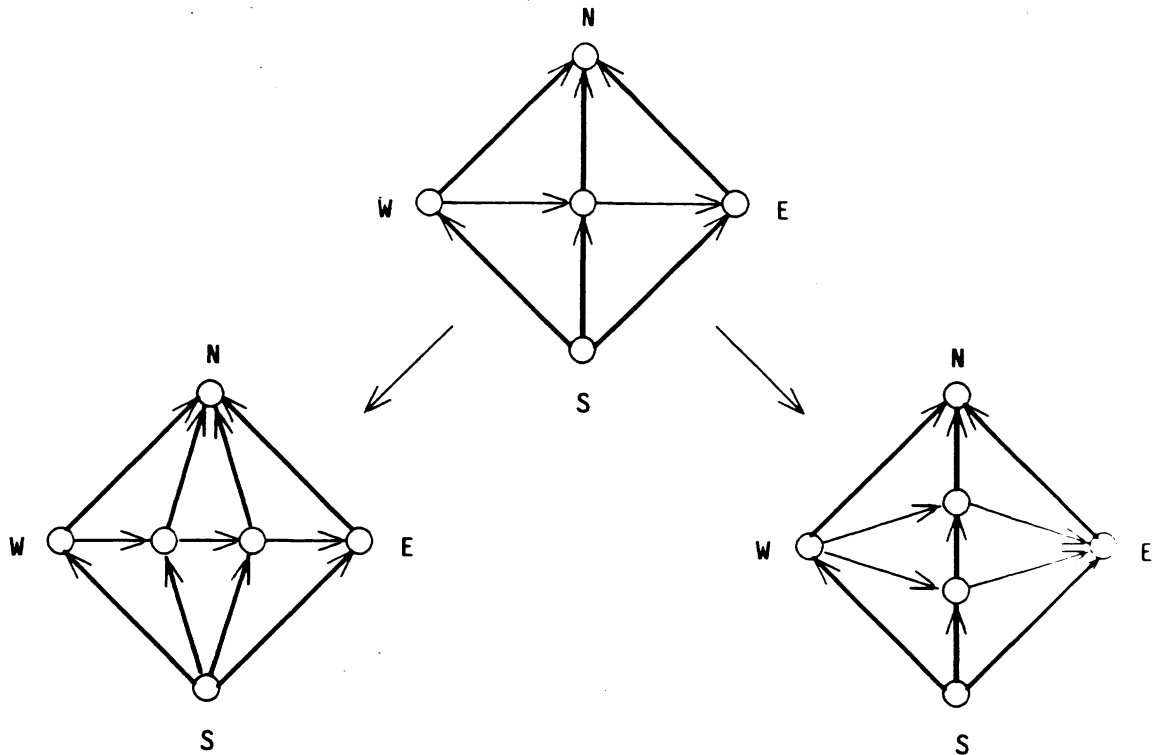


Figure 14: Generation of two structures S_2 from S_1

For every vertex w so that $w \in \{r_{b',i'} \mid i' < \rho(b')\}$, $a_{w,1} \mathbf{R}l_{w,\lambda(w)}$ in both G_n and G_{n+1} , and the incidences between $a_{w,1}$ and the other vertices directly to the left of w in G_n remain unchanged in the transition from G_n to G_{n+1} . Since w satisfies (11) in G_n , it also satisfies (11) in G_{n+1} and G_{n+1} is restricted.

In a similar way, it can be shown that an application of rules 1, 2 or 4 to G_n generates a restricted orthogonal structure G_{n+1} . The theorem then follows by induction on n .

Theorem 11: (Completeness) Every restricted orthogonal structure G_n is generated from G_1 by a series of applications of rules 1 to 4.

Proof: (Sketch). Let G_n be a restricted orthogonal structure. Observe that the last vertex directly to the right of W , c , is the second vertex directly below N . The configuration of arrows incident with c must belong to exactly one of the cases depicted as the right-hand sides of rules 1 to 4 in Figure 12. By applying the appropriate rule 'backwards', a restricted orthogonal structure G_{n-1} is generated. This fact suggests an inductive proof of the theorem.

Corollary 12: The sequence of rule applications generating an orthogonal structure is uniquely determined.

Laboratory of the Department of Architecture at Carnegie-Mellon University. A pilot version, called LOOS, has been implemented and can be used to generate non-isomorphic restricted orthogonal structures. Rather than showing these structures directly to the user (who might have a hard time trying to understand them), the program derives, for each structure it has generated, a loosely-packed arrangement of rectangles represented by that structure and displays this arrangement to the user, **thic** arrangements selected contain only non-trivial holes, thus enabling the user to deduce the underlying structure without ambiguity (by simulating the process employed in the proof of Theorem 1).

Examples of such **arrangements** are shown in Figure 15. The first of **these** is **represented** by a structure to which **all rules can be applied, and rules 1 to 3 can be applied under more than one assignment of parameters**. The results of **these applications** are **illustrated by the remaining arrangements shown in Figure 15**.

LOOS was also used to count the number of non-isomorphic restricted structures with up to 10 internal vertices; the results are listed in Table 2.

n	number of non-isomorphic, restricted structures G_n
1	1
2	2
3	6
4	24
5	116
6	642
7	3,938
8	26,194
9	186,042
10	1,395,008

Table 2: Enumeration of non-isomorphic restricted structures

The grammar implemented through LOOS can be extended in a straight-forward way to also generate all assignments of labels to the interior vertices of an orthogonal structure. This can be done either by generating all permutations of assignments after a complete structure has been produced: or by assigning the labels that have not been assigned yet to the vertex c inserted during each application of a rule. Both methods have disadvantages. The first method makes it impossible to use constraints (which are usually specific to the objects that are allocated) for pruning the search tree during the generation, a feature that is indispensable for efficient searches. In the second method, the order in which the objects are allocated changes between **LCIL** branches, which makes it difficult for users to follow the process (it also creates inefficiencies because in

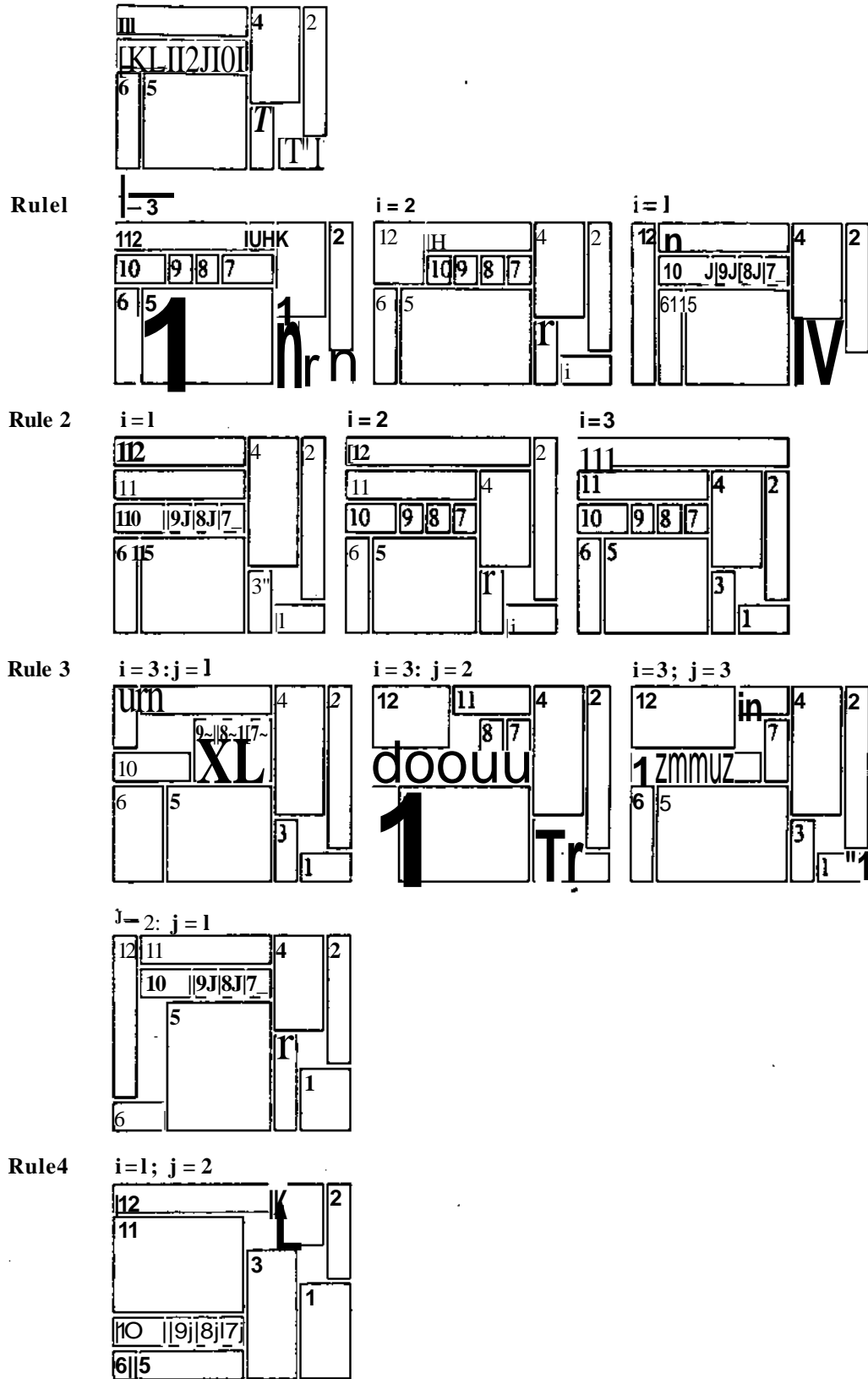


Figure 15: Program I.OOS - s;unplc output

higher constrained objects should be allocated first). In order to allocate labelled objects in a given (user-defined) order, the grammar must be expanded to allow for an allocation not only in the upper left corner, but everywhere in the developing configuration.

The design of such a grammar has a precedent in the grammar described in [5] for the generation of rectangular dissections with labelled components. Each corner of such a component can be formed by two walls in exactly two ways; thus, there exist $2^4 = 16$ possibilities for forming the four corners of a component. In order to generate these configurations, 16 rules are needed at the outset. The quoted paper shows, however, that the number of required rules can be reduced under suitable parameterizations. Given this precedent, the task to develop an expanded grammar for the generation of restricted orthogonal structures with labelled vertices, where the vertices enter the process in a fixed order, is clear-cut. There are four possibilities for the configuration of rectangles at a corner of a given rectangle in a loosely-packed arrangement of rectangles. This results in $4^4 = 256$ possibilities for the configuration of rectangles at the four corners of that rectangle and in the same number of possibilities for the vertices incident with the corresponding vertex in a restricted orthogonal structure. Thus, 256 rules are needed at first to generate these possibilities. To make the task of designing and testing these rules more manageable, parameterizations are desired that drastically reduce the number of required rules. The specification of these rules will be the topic of a second paper.

4 A Generative Expert System for the Design of Architectural Layouts

So far, the discussion has focussed on the syntactic properties of loosely-packed arrangements of rectangles and their representations. But for each problem domain, the rectangles being allocated have a specific meaning, and specific constraints, criteria, guidelines or rules govern the allocation of these objects. To avoid confusion, ^{two} types of rules should be distinguished in this context: *generative* rules, such as the ones described in the previous section, which create representations of layouts; and *diagnostic* rules used to evaluate a layout. Among the latter, it is useful to further distinguish rules that evaluate *constraints* (i.e. properties a solution must possess if it is to be considered acceptable or feasible) from those that evaluate *criteria* (i. e. properties that make certain layouts better than others).

The incorporation of diagnostic rules into the generation process is indispensable for several reasons. These rules assure, first of all, that the generated objects represent meaningful solutions to the problem at hand; in addition, they can be used to filter out the less promising solutions so that users are presented with a manageable set of alternatives for further analysis and evaluation. The rules might also provide an important device to prune the search tree so that the computations involved become feasible.

Section 1 argued that many diagnostic rules are never stated explicitly in a problem description, nor have they been systematically documented and collected anywhere. They are part of the general expertise of designer which is acquired over years of practice and remains unarticulated unless designers are forced to explain the faults of a particular solution. The section also introduced expert systems as vehicles to extract exactly this type of knowledge from experts and to encode it explicitly in the form of a knowledge base, which is used by the system to solve problems within their field of expertise. This knowledge base is built up through a sequence of iterations in which experts observe the performance of the program; criticize its performance; inspect the knowledge that has been used; and suggest additions or modifications to the knowledge base. To facilitate this process, expert systems are programmed in a style that contrasts with the traditional, "pencil and paper" approach by making changes in the knowledge base as easy as possible.

Section 1 suggested that the performance of layout generators can improve if they take on the form of an expert system. A precedent that appears particularly interesting within this context is the DENDRAL program, an expert system that predicts the chemical structure of certain compounds from their molecular weights and specifications (by type and number) of the atoms in the compound (see [2] or [1] for description of the program). The core of the program consists of a generator that produces candidate structures which are tested against the given spectrum; the structures most likely to have a spectrum of that kind are presented to the user (in a ranked order). The structures are represented as planar graphs; and the closure and implementation of the process (with respect to the set of possible chemical structures) has been proved mathematically.

space searched by the generator is restricted by *ajlgnez*, a program which infers constraints from the input data in order to reduce the (possibly large) number of structures that must be generated (and subsequently tested). The *tester*, in turn, accepts a candidate structure from the generator, predicts its mass spectrum and compares it to the given spectrum. Unlike the generator, the tester is not based on a complete and systematic theory, but reflects the various bits of knowledge expert chemical analysts bring to bear on this task. The program was used over a long series of test runs to discover and encode this knowledge in the manner described above (a detailed account of this process is given in [3]).

The remainder of this section will outline an expert system for the design of architectural layouts which is loosely modelled after DENDRAL. The major components of the system are the generator and the tester which are again developed by contrasting modes of reasoning: the generator is completely specified by a deductive theory established *a priori*, while the tester is to be built up inductively over a series of applications.

The generative rules described in the previous section (or an expanded version of these rules) can form the basis of a generator able to produce all possible orthogonal structures with a given number of vertices to represent loosely-packed arrangements of the same number of rectangles. The rules by themselves, however, do not completely specify this generator. Any intermediate structure generated by a series of rule applications can normally be expanded by more than one rule and under various assignments of values to the parameters in the rule. In order to select a particular application, a *control strategy* is needed which, together with the initial configuration, completes the specification of the generator.

Such a control strategy is easy to define if the solution set is to be completely enumerated. In this case, an intermediate structure must be expanded in every possible way, a process that can be implemented in a straight-forward manner as depth-first search through an appropriately constructed search tree whose nodes correspond to the intermediate or terminal solutions that are generated. The program DIS, for example, uses this type of control strategy. The same program has also shown that the search tree must be pruned extensively if problems calling for the allocation of even a moderate number of objects are to become tractable. The generative rules used by DIS, as well as the rules shown in the previous section, make it possible to impose certain problem constraints or criteria for this purpose. For it can be shown that many constraints and criteria that are not satisfied by an intermediate solution cannot be satisfied by any solution derived from that intermediate solution; therefore, those intermediate solutions do not have to be expanded. The program DIS uses only rectangular adjacencies to this end. A control strategy which becomes efficient if enough of these constraints are imposed. Constraints that can only be evaluated if the layout is complete are formulated for each terminal node used to further reduce the number of alternatives (examples of this type of constraints are constraints on dimensions or areas which can only be satisfied in certain densely-packed arrangements if a sufficient number of objects has been allocated). Still, the number of alternatives presented to the user can remain limited.

morcjJiorough^selection is needed, taking into account not only constraints, but also criticjJaJtoiiUiclp to find the better solutions among the feasible ones.

I suggest that at least for a pilot system, this purpose can be achieved by a branch-and-bound strategy which expands those and only those intermediate solutions which are at least as good as any other solution generated before (independent of its depth in the search tree). To evaluate a node, I suggest using a simple evaluation function which computes for each node, s , the triple $\langle p(s) = \langle c(s), d(s), e(s) \rangle$, where $c(s)$ is the number of constraints, $d(s)$ the number of 'strong' criteria and $e(s)$ the number of 'weak' criteria violated by s . Based on these triples, solutions can be ranked lexicographically'.

An example of a diagnostic rule evaluating a constraint is the following:

The sum of the minimum horizontal dimensions of any sequence of objects arranged from left to right between W and E cannot exceed the maximum horizontal dimension of the available area.

Clearly, this constraint can be used to prune the search tree provided that the addition of a new object does not alter the spatial relations between the objects that are already allocated (the rules presented in the previous section guarantee this property.) Experiments with DIS have shown that this type of constraint is one of the most frequently violated dependent constraints; it should therefore provide for an effective pruning device. (Incidentally, this constraint also demonstrates how dimensional considerations can enter the generation process at early stages.)

If the given design problem deals with the remodelling of a kitchen, the following rule might evaluate a criterion:

The sink should be adjacent to the existing plumbing stubs.

For the same type of problem, the following rule might be used to evaluate a weak criterion:

If the main food preparer is right-handed, the range should be to the right of the main VMU surface (when viewed from the front).

The challenge is to design and implement a tester which returns the proper value of the objective function, taking a broad range of constraints and criteria into account which, at the outset, are not known, but are added to the evolving knowledge base with care, preferably through declarative statements of the type * above.

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