

This article was downloaded by:

On: 14 January 2011

Access details: *Access Details: Free Access*

Publisher *Taylor & Francis*

Informa Ltd Registered in England and Wales Registered Number: 1072954 Registered office: Mortimer House, 37-41 Mortimer Street, London W1T 3JH, UK



## Molecular Simulation

Publication details, including instructions for authors and subscription information:

<http://www.informaworld.com/smpp/title~content=t713644482>

### Parallel Computation of the Matrix of the Chemical Distances for Defective Graphs

Ottorino Ori<sup>a</sup>; Giulio Destri<sup>b</sup>; Paolo Marenzoni<sup>c</sup>

<sup>a</sup> Thinking Machines Corporation Cambridge, MA <sup>b</sup> Dipartimento di Ingegneria dell'Informazione Università di Parma, Parma, Italy <sup>c</sup> Dipartimento di Fisica Università di Parma, Parma, Italy

**To cite this Article** Ori, Ottorino , Destri, Giulio and Marenzoni, Paolo(1994) 'Parallel Computation of the Matrix of the Chemical Distances for Defective Graphs', *Molecular Simulation*, 12: 1, 49 — 56

**To link to this Article:** DOI: 10.1080/08927029408022535

**URL:** <http://dx.doi.org/10.1080/08927029408022535>

PLEASE SCROLL DOWN FOR ARTICLE

Full terms and conditions of use: <http://www.informaworld.com/terms-and-conditions-of-access.pdf>

This article may be used for research, teaching and private study purposes. Any substantial or systematic reproduction, re-distribution, re-selling, loan or sub-licensing, systematic supply or distribution in any form to anyone is expressly forbidden.

The publisher does not give any warranty express or implied or make any representation that the contents will be complete or accurate or up to date. The accuracy of any instructions, formulae and drug doses should be independently verified with primary sources. The publisher shall not be liable for any loss, actions, claims, proceedings, demand or costs or damages whatsoever or howsoever caused arising directly or indirectly in connection with or arising out of the use of this material.

# PARALLEL COMPUTATION OF THE MATRIX OF THE CHEMICAL DISTANCES FOR DEFECTIVE GRAPHS

OTTORINO ORI

*Thinking Machines Corporation  
Cambridge, MA 02142-1214*

GIULIO DESTRI

*Dipartimento di Ingegneria dell'Informazione Università di Parma, Viale delle Scienze 43100 Parma (Italy)*

PAOLO MARENZONI

*Dipartimento di Fisica  
Università di Parma, Viale delle Scienze 43100 Parma (Italy)*

*(Received April 1993, accepted April 1993)*

We report for an efficient parallel SIMD algorithm, implemented on the Connection Machine, calculating the distance matrix on a large class of defective graphs (graphs with vacancies) representing a given chemical structure. The crucial algorithmic aspects are described in details. The first application of our method simulates the diffusion of vacancies in a periodic square lattice under the effects of a novel, pure *topological* potential: the Wiener number of the graph.

KEY WORDS: Distance matrix, defective graphs, Wiener index, Löwenstein rule, Connection Machine

## 1 INTRODUCTION

In a recent paper [1] we presented a parallel implementation on the Connection Machine (CM) [2] of a fast algorithm for calculating the entries of the matrix of the chemical distances  $D$  for a given chemical graph  $G$ . As usual,  $G$  is defined by giving a set of nodes (vertices) interconnected by a set of bonds (edges). Thinking for example of a crystalline lattice, the related graph can be easily built by identifying the lattice atoms with the graph vertices. The chemical bonds become the edges of the graph which accounts only for the topological features underlying the initial crystalline structure. All the geometrical data, first of all bond distances and angles, are neglected, and a set of topological methods can be conveniently used in order to derive a large class of physico-chemical data on the proposed system (see the review [3] and [4]). In particular, reference [1] shows an interesting application, based on the knowledge of the  $D$ 's elements, allowing the partial determination of the  $^{13}\text{C}$  NMR spectrum of fullerene molecules.

The current paper still deals with the parallel determination of  $D$ , this time being focused on *defective graphs* (DG's). With this term, we will refer to graphs generated from a pre-existing regular (without defects) graph  $G$ , by inserting a given number of holes. From this point of view, *defective graphs* present a wide class of possible irregularities (see next paragraph) which force to find out computational tools able to handle a big variety of cases. We will show that, after minor changes, our algorithm [1] performs very well also in calculating  $D$  for *defective graphs*. The next paragraphs list both pathologies commonly encountered with *defective graphs* and adopted computational solutions.

We will close the article with a simple example of topological simulation of holes migrating in a lattice. This kind of theoretical study takes place on a set of consecutive *defective graphs* and generally implies big changes in their topology. In the reported example we will follow, within a periodic square lattice, the diffusion of a set of vacancies under the sole  $D$ 's influence. This practically unexploited [5] way of describing the diffusion mechanism in a given chemical structure, relies only on the Wiener number:

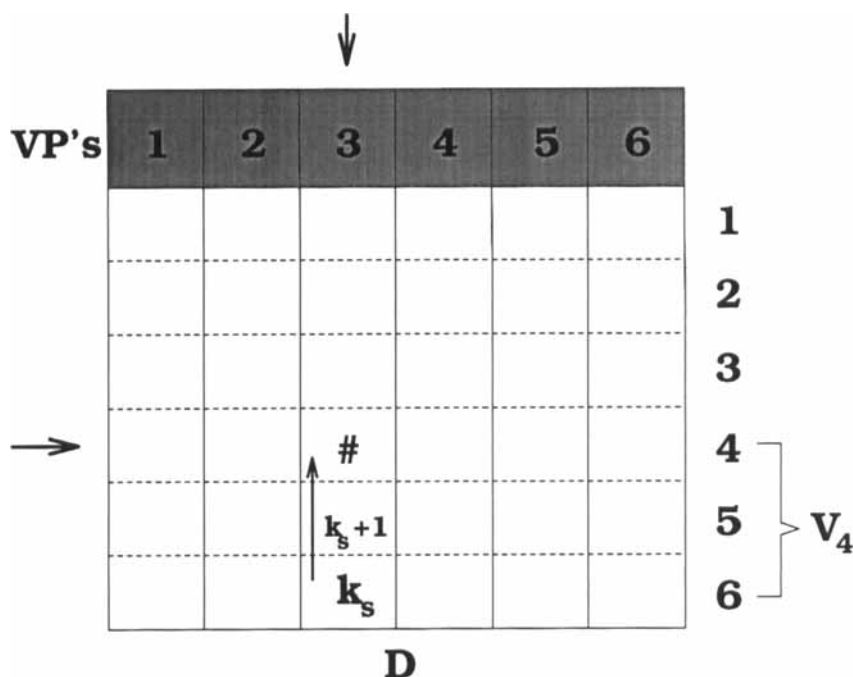
$$W(G) = \frac{1}{2} \sum_{i,j=1}^N d_{ij} \quad (1)$$

of the involved *defective graphs*. In (1) the integers  $d_{ij}$ 's (expressing the number of bonds joining the two vertices  $i$  and  $j$  along the shortest path in  $G$ ) are the elements of  $D$ . Under the action of this new kind of topological interaction, the system presents some physically interesting behaviors, which will be illustrated in detail.

## 2 THE ALGORITHM FOR DEFECTIVE GRAPHS

Figure 1 summarizes the salient features of our parallel computation of  $D$  for a connected graph with  $N$  vertices. The only input data the algorithm needs are the so called *adjacency lists* (AL's) which store in a very simple manner the connectivity information. AL's consist in a set of  $N$  monodimensional arrays  $v_i$ , containing in the first place the number  $n_i$  of vertices connected to the  $i$ th node. In the remaining  $n_i$  positions the labels  $j_1, j_2, \dots, j_{n_i}$  of these vertices are stored (see Figure 2a). These  $v_i$ 's are conveniently positioned in the memory of the serial computer working as CM's front end, avoiding in this manner time costly inter-processors communications [1]. The  $d_{ij}$ 's evaluation is reached following a *pulling* approach: starting from the knowledge of the first coordination shell (the set of nearest neighbours) of a given node  $i$  and assuming completed the calculation of its  $k$ th coordination shell, we can fill the  $(k+1)$ th one, simply checking, among the remaining not connected nodes  $j$  of the graph, if one of these  $j$ 's has at least a nearest neighbour already belonging to the  $k$ th shell of  $i$ . If this is the case,  $d_{ij} = k+1$ . Our parallel code performs the calculation of  $D$  a row at a time, the task being done when all  $d_{ij}$ 's are known.

As we have stressed above, this algorithm has a natural flexibility and it can be used for getting  $D$  on a general graph. The first good feature of this method, is that the value  $n_i$  does not need to be equal for all the lattice nodes  $i$ . In particular  $n_i$  can be set to zero when the  $i$ th node is hosting a hole. Hence we can kill vertices of a starting graph  $G$ , keeping our parallel computation of  $D$  perfectly working,

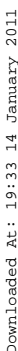


**Figure 1** The  $D$ 's columns are stored in the local memory of the CM's virtual processors (VP's). The code gets a  $D$ 's row at a time. Computing for example on a graph with six nodes the fourth  $D$ 's row, the  $d_{43}$  entry is determined following a double test: i)  $d_{43}$  has to be unknown (usually a negative integer # marks these elements); ii) one of its first neighbours (the 6th node in our example) has to be already connected to the 4th one, with  $d_{46} = k_s$  ( $k_s$  being the value of the previously completed coordination shell).  $v_4$  contains the information on the connectivity of the 4th node. When all the #'s disappear the calculation is done.

the only effort being the implementation of an efficient method for updating AL's. Putting  $N_h$  holes on  $G$ , we generate two "symmetric" effects: i) we lose the  $n_i$  bonds centered on  $i$  (being  $i$  one among the  $N_h$  vacancies); ii) we reduce by one the connectivity of the  $n_i$  atoms belonging to the  $i$ 's first coordination shell. Another situation to take care of is the possibility that, with a sufficiently high number of holes, one gets a non-connected graph (a graph in-which one or more sites are disconnected from the remaining ones). If this is the case, some of the  $d_{ij}$ 's will remain indetermined at the end of the  $D$ 's calculation.

Summarizing, our experience with *defective graph's*, did suggest four basic modifications of our standard procedure, itemized as follow:

- When a vacancy lies on a node  $i$ , the  $n_i$  value (the number of  $i$ 's bonds) is set to zero. As usual,  $n_i$  is stored in the first  $v_i$ 's place (see Figure 2).
- For each hole  $i$ , we change the connectivity of its nearest neighbours. If  $j$  is one of these vertices, we have to decrement  $n_j$  by one and we have to modify  $v_j$  also, taking into account that the bond with the site  $i$  has been removed. Shifting the  $n_j$  surviving bonds in the places  $v_j(2)$ ,  $v_j(3)$  ...  $v_j(1 + n_j)$ , is the simplest solution of that problem (see Figure 2b).



Downloaded At: 19:33 14 January 2011

Downloaded At: 19:33 14 January 2011

Downloaded At: 19:33 14 January 2011

- Downloaded At: 19:33 14 January 2011

Downloaded At: 19:33 14 January 2011

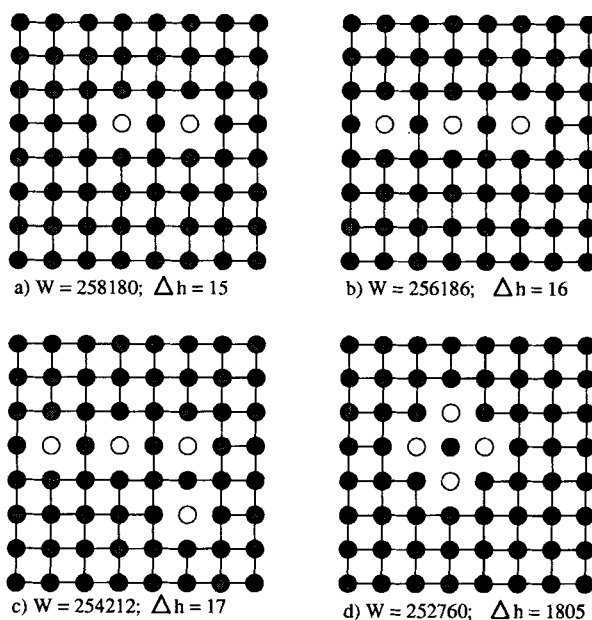
	1	2	3	4	5	6
1	0	#	#	#	#	#
2	#	0	#	#	#	#
3	#	#	0	#	#	#
4	#	#	#	0	#	#
5	#	#	#	#	0	#
6	#	#	#	#	#	0

a

	1	2	3	4	5	6
1	0	#	#	0	#	#
2	#	0	#	0	#	#
3	#	#	0	0	#	#
4	0	0	0	0	0	0
5	#	#	#	0	0	#
6	#	#	#	0	#	0

b

**Figure 3** The initial  $D$ 's values for a regular graphs (a) and for a *defective graphs* with a hole placed on the 4th node (b), are given.



**Figure 4** For a  $L=16$  periodic square lattice,  $G_{min}$  and  $E_{min}$  are reported for  $N_h = 2, 3, 4$ . For simplicity, only a little section of the lattice is depicted. The ideal periodic square lattice has  $W=262144$ .  $\Delta_h$  represents the energy barrier separating the proposed  $C_{min}$ 's from other configurations. a) and b) respectively give the most compact configuration when 2 or 3 holes are present. For the  $N_h = 4$  case, two  $G_{min}$  are given: c) the lattice is still a connected one; d) the holes break the lattice in two disconnected parts. In this last case, we made the assumption that the indeterminate  $D$ 's elements do not contribute to  $W$ .

complications arise. Labeling with  $i$  and  $j$  two nodes lying in two distinct subgraphs, the related distance  $d_{ij}$  can not be computed (there is no paths connecting those vertices). Thus we have a new criterion for considering the  $D$ 's computation terminated:

- For disconnected *defective graph's* the calculation of the  $i$ th row of  $D$  finishes when the value of the current shell  $k$  exceeds a given cut-off  $M$ .

The possibility of defining such a cut-off is intuitively obvious ( $M$  corresponds to the length of the longest path in  $G$ ), and gets theoretical support from our previous results relating  $M$  to the structure (number of nodes  $N$ , dimensionality  $d$  and topology) of the underlying ideal graph  $G_r$ . For example, for  $d$ -dimensional tori we found:

$$M_d(N) = \frac{dN}{2} \quad (2)$$

whereas for a Sodalite unit cell embedded in a Sodalite lattice made by  $L \times L \times L$  cells one has:

$$M_{\text{sod}}(L) = 3L + 1 \quad (3)$$

The four algorithmic “tricks” listed above, do not substantially alterate the data parallel layout of Figure 1, being therefore easily implemented on the CM.

### 3 APPLICATION TO A PERIODIC SQUARE LATTICE

The importance in having for *defective graph's* a general purpose tool for deriving the distance matrix  $D$ , is outlined in the following investigation, where the diffusion of a set of holes in a periodic square lattice (with edge  $L$ ) is treated by mean of a Monte Carlo (MC) simulation [6] based on the knowledge of the sole  $W(G)$  (1).

In our system,  $N = L^2$  nodes constitute the reference ideal 4-connected graph  $G_N$  in which a set of the  $N_h$  vacancies can migrate adjusting their position in order to minimize the Wiener number of the resulting defective graphs  $G_{N_h}$ . We can thus define the energy of the system simply as  $E = JW(G)$ , where the coupling constant  $J$  will be set to one in the current paper. When  $N_h$  holes are present,  $W(G_{N_h})$  takes contribution from the paths interconnecting  $N - N_h$  occupied nodes. Starting from a given configuration  $G_{N_h}(0)$ , where  $N_h$  holes are randomly introduced on  $G_N$ , the initial energy value is computed as  $E_0 = W(G_{N_h}(0))$ . Following the usual MC technique, one can choose randomly, for each hole, one among its occupied nearest neighbours (their number ranges between zero and four), moving there the hole. In this way a new graph  $G_{N_h}(1)$  is generated. With respect to  $G_{N_h}(0)$ ,  $G_{N_h}(1)$  presents some of the  $N_h$  holes located on a different lattice node, implying both the reconstruction and the deletion of some of the  $G_{N_h}(0)$ 's bonds. For this proposed new configuration, we carry out the calculation of  $E_1 = W(G_{N_h}(1))$  and, invoking the well known Metropolis rule, the new configuration is accepted or rejected according to its Boltzmann weight, that is:

$$e^{-\beta \Delta E} = e^{-\beta J(E_1 - E_0)} \quad (4)$$

where  $\beta \propto T^{-1}$  takes into account the temperature effects on the present system.

The Metropolis rule states that when  $E_1 > E_0$  the new configuration is accepted if the above Boltzmann weight exceeds a number  $r$  randomly generated between zero and one. The opposite case ( $E_1 < E_0$ ) is systematically accepted. When  $\beta$  is big "enough" (for our model this means  $\beta \approx 0.5$ ) the system tends toward the configuration  $C_{min}$ , described by the graph  $G_{min}$ , reaching in this way the energy minimum. On the other hand, simulations done with lower values of  $\beta$  ( $\beta \approx 0.1$ ) force the system to change configuration describing large oscillations around  $C_{min}$ , and allow the determination of both  $G_{min}$ 's topology and the energy hypersurface profile [6].

Figure 4 reports the results ( $G_{min}$  and  $E_{min}$ ) of a sets of calculations carried out for a periodic square lattice with  $L = 16$  and  $N_h = 2, 3, 4$ . For a given  $N_h$ , the  $\Delta h$  represents the energy barrier separating the proposed  $C_{min}$ 's from other configurations. The existence of such a barrier, implies that, for each  $N_h$ , the holes reach the stable ( $\beta = 0.5$ ) configuration  $C_{min}$  in which a well defined order appears. Although this finding will be investigated in future works for understanding the nature of this apparent "phase transition", some general consideration can be done. Under the action of the Wiener energy  $E$ , the  $N - N_h$  occupied nodes dynamically vary their connectivity to maximize their global compactness (minimizing the sum over all the  $d_{ij}$ 's). In doing this, configurations where two or more holes are nearest neighbours are energetically unfavorable, as if they were implicitly interacting in a repulsive way. This may reflect the Löwenstein rule, a well known constraint regarding the available configurations that aluminum atoms have when they are replacing silicon on the nodes of a zeolitic lattice [7]. Löwenstein rule states that Al atoms can not occupy adjacent positions, and it is usually explained in terms of the tendency of the system to reduce the electrostatic repulsive interaction among  $Al^{3+}$  ions. Topologically, the relationship between a hole and an impurity is very close: both can be in fact simulated, considering their bonds having different length with respect to the remaining  $G$ 's bonds. In particular, the configurations of Figure 4, can be reproduced when we consider the  $N_h$  holes as graph nodes having *very long* bonds (instead of the adopted picture presenting the holes as void vertices without any bond). This similarity between holes and impurities, together with the current results, points out that an alternative, topological foundation of the Löwenstein rule can be found, and future work on this topic will be carried out.

The last remark has a computational nature. For the systems with  $N_h = 4$  depicted in Figure 4c and 4d the computational time on a 8K CM2 is about 500 seconds for a MC simulation with 256 iterations.

## 4 CONCLUSIONS

We generalized a previously proposed algorithm for calculating the matrix of the chemical distance for a large class of graphs with vacancies. Its parallel implementation performs really well in dealing with the various *defective graph's* encountered simulating the diffusion of holes in a crystalline lattice. We think this tool can be usefully applied for studying, for example, the stability of bulk zeolites when impurities (Al, Ti and so on) substitute silicon in the tetrahedral sites.

### Acknowledgements

The authors are indebted with Prof. Gianni Conte of Parma University who made the local Connection Machine generously available throughout the course of this work.

### References

- [1] O. Ori and P. Marenzoni, "Parallel Computation of the Matrix of the Chemical Distancies on the Connection Machine" *Mol. Sim.* **10**, 00 (1993).
- [2] *Connection Machine CM-200 Series Technical Summary*, Thinking Machines Corporation, Cambridge, Massachusetts, 1991.
- [3] D.H. Rouvray, "Predicting Chemistry from Topology", *Scientific American*, 36-43 (October 1986).
- [4] N. Trinajstić, *Chemical Graph Theory*, CRC Press, 1983.
- [5] D. Bonchev, early 80's, proposed the study of the Wiener number for, defective square and cubic lattices. D. Bonchev, private communication.
- [6] N.E. Cusack, *The Physics of Structurally Disordered Matter. An introduction* Adam Hilger, Bristol 1988.
- [7] G. Melegari and O. Ori, "Computer-aided Topological Analysis of the Faujasite Lattice I: Exact Solution for Zeolite-X", *Mol. Sim.* **3**, 235-250 (1989).