

# A greedy approach to transversal selection for nonlinear systems of equations

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**Abstract.** Interval methods have been established for rigorously bounding all solutions of a nonlinear system of equations within a given region. In this paper, we introduce a new method for determining a good pivoting sequence for Gauss-Seidel method, based on a greedy algorithm, called 4M, solving assignment problems with worst case complexity  $O(n^2)$ .

**Key words:** nonlinear systems, interval arithmetic, interval Newton methods, perfect matching, transversal.

## 1 Introduction and Motivation

We consider the problem of finding with certainty *all* zeros of a nonlinear continuously differentiable function  $f : \mathbb{R}^n \rightarrow \mathbb{R}^n$  in a given interval vector  $[x] \in \mathbb{IR}^n$  (an  $n$ -dimensional box). This problem is difficult due to its inherent computational complexity (NP-hard) and due to numerical issues involved to guarantee correctness. Interval Newton methods have been established for finding all real roots within the specified domain of a nonlinear system with both mathematical and computational certainty. In such methods, the basic idea is to apply the interval Gauss-Seidel method to the preconditioned linearized system [12]. Nowadays, the *interval Gauss-Seidel method* [5, 13] serves as a basis not only for interval Newton algorithms (see [4, Chapter 13]) but also for interval constraint algorithms [6]. However, this method is “blind” since it works in a straightforward manner, without taking account the coupling between the variables and functions. A natural question that arises is: if it is possible to dynamically accelerate the convergence rate of nonlinear Gauss-Seidel method, that still remains an open problem.

Herbort & Ratz [7] introduced the problem in their attempt to develop a new componentwise Newton operator, using a univariate Newton iteration on a unary projection of  $f_i$  onto one of the variables  $x_1, \dots, x_n$ . Actually, finding such an assignment set is known as finding a *transversal* in the incidence matrix associated with the problem. Thus, a transversal may not be unique, but finding a “good” one is not a trivial problem. Sotiropoulos et al. [14] suggested to compute a transversal as a preprocessing step to interval Gauss-Seidel method for solving

polynomial systems based on the structure of the equations. In recent works, Goulard [2] and Goulard & Jermann [3] investigated the impact of the selection of a transversal on the speed of convergence of interval methods based on the nonlinear Gauss-Seidel procedure. In [3], the authors concluded that it is not possible to select statically a good transversal at the beginning of the solving process, and therefore, the selection must be reconsidered dynamically at each iteration of the solving process.

In this work, we propose a greedy algorithm which determines a transversal dynamically by exploring information not only from the *incidence matrix* (static) but also from the current subregion (dynamic). The algorithm has the advantage that it does not use any first order information, in contrast to the previous proposed algorithms [7, 2, 3, 14]. From our point of view, the selection of an transversal can be seen as a *matching problem* on the bipartite graph  $G = (\mathcal{F}, \mathcal{X}, E)$  associated with the the incidence matrix of the nonlinear system.

## 2 The greedy algorithm 4M

Given a system of nonlinear equations of the form

$$f_i(x_1, x_2, \dots, x_n) = 0, \quad 1 \leq i \leq n \quad (2.1)$$

where the variables  $x_j$ ,  $j = 1, \dots, n$  are bounded by real intervals i.e.  $x_j \in [x_j]$ . The associated *incident matrix*  $A = [a_{ij}]$  of the nonlinear system (2.1) is a zero-one matrix where  $a_{ij}$  is set to 1 if variable  $x_j$  occurs in function  $f_i$ . We represent the incidence matrix with a bipartite graph  $G(\mathcal{F}, \mathcal{X}, E)$  where each vertex  $f_i \in \mathcal{F}$  and  $x_j \in \mathcal{X}$  corresponds to the function  $f_i$  and the variable  $x_j$  of the nonlinear system (2.1), respectively. In order to seriate the vertices of each vertex set we apply an ordering relation between them, associating a tuple, consists of information from the nonlinear system. Specifically, for each vertex  $f_i \in \mathcal{F}$  we associate the tuple  $\{d_G(f_i), w([f]_i)\}$  and for each vertex  $x_j \in \mathcal{X}$  the tuple  $\{w([x]_j), d_G(x_j)\}$ .

The algorithm is iterative and requires as input only the bipartite graph  $G(\mathcal{F}, \mathcal{X}, E)$ . At each iteration, Algorithm-4M selects the vertex  $f_i \in \mathcal{F}$  with the minimum degree. If this vertex it is not unique, we select the least of them according to the tuple of each vertex. Afterwards, it is matched with its best neighbor that is, the vertex with the biggest tuple, in  $O(n^2)$ . The two matched vertices are eliminated from further processing and consequently the degree of each of their neighbors is decreased by one. The edge incident to the selected vertices is inserted in the matching set  $\mathcal{M}$ . Further more at any iteration of this process, if any vertex in set  $\mathcal{X}$  has degree equal to one then it is matched with its unique neighbor and the vertices are removed from the graph, as well. The iterations are repeated until that bipartite graph is empty, in  $O(n^2)$ . Finally, every edge  $(f_i, x_j)$  in  $\mathcal{M}$  is sorted according to the tuple of each vertex  $x_j$ .

Every edge of set  $\mathcal{M}$  determines the transversal of the nonlinear system at the current iteration. In particular, the edge  $(f_i, x_j) \in \mathcal{M}$ , represents the element

$(i, j)$  of the incidence matrix, which implies, in terms of nonlinear system, that variable  $x_j$  shall be projected onto the function  $f_i$ .

We establish that the feasibility of the matching problem on the bipartite graph  $G$  ensures the existence of the perfect matching, not its uniqueness. Our proposed algorithm looks for the appropriate perfect matching among all others, nevertheless, all other existing perfect matchings don't satisfy the primitives of the greedy selection we have defined.

**Lemma 1.** *Suppose the bipartite graph  $G(\mathcal{F}, \mathcal{X}, E)$ , arising by the representation of the incidence matrix of a nonlinear system (2.1), where  $\mathcal{F}$  is the set that corresponds to the functions,  $\mathcal{X}$  is the set that corresponds to the variables and  $E = \mathcal{F} \times \mathcal{X}$ . Algorithm-4M achieves a perfect matching of graph  $G$ , in  $O(n^2)$ .*

Note that once a vertex is matched and removed from the bipartite graph, it is never revisited by the algorithm and all the other unmatched edges incident on it are removed from the graph, thus proving the correctness of the algorithm. Further, the algorithm returns a perfect match, that is because once two vertices are matched, they remain matched until the end of the process.

### 3 Numerical results

In this section, we introduce experimental results in order to demonstrate the accelerating of the efficiency of interval Gauss-Seidel method using our proposed algorithm as a preprocessing step (4M+Gauss-Seidel) and comparing it with the traditional method (Gauss Seidel) in a variate of benchmarks. The test problems have been taken from numerical [1, 8, 11] and interval analysis [7, 10] papers.

The implementation has been carried out in C++ using the C-XSC 2.0 library [9]. We present illustrative examples, highlighting the performance and the superiority of our proposed method.

| Solving process |             | Gauss-Seidel |         |         | 4M+Gauss-Seidel |        |       |
|-----------------|-------------|--------------|---------|---------|-----------------|--------|-------|
| No.             | Problem     | FcEv         | JcEv    | Ps      | FcEv            | JcEv   | Ps    |
| 1.              | Floudas     | 17167        | 13306   | 3845    | 1351            | 989    | 345   |
| 2.              | Ex.Powell   | 259284       | 168471  | 90805   | 138977          | 94499  | 44470 |
| 3.              | Cyclohexane | n/a          | n/a     | n/a     | 44747           | 36017  | 8713  |
| 4.              | Kinematics  | 17155        | 13164   | 3975    | 2340            | 1757   | 567   |
| 5.              | Powell      | 6591088      | 5459059 | 1132028 | 2642            | 2123   | 517   |
| 6.              | Caprasse    | 1520810      | 1329956 | 190815  | 170918          | 149249 | 21633 |
| 7.              | Brown5      | 125092       | 93113   | 31976   | 20481           | 14959  | 5519  |
| 8.              | Economics5  | 567619       | 474293  | 93321   | 47728           | 39351  | 8373  |
| 9.              | Economics6  | n/a          | n/a     | n/a     | 389061          | 336795 | 52262 |
| 10.             | 6Body       | n/a          | n/a     | n/a     | 210983          | 176067 | 34911 |

Table 1 compares the results of the two solving processes applied to ten test problems. The first row denotes the method that has been used as solving process

for isolating all zeros of a nonlinear system. For each test problem we list the number of function (FcEv) and jacobian (JcEv) evaluations and the number of pruning steps (Ps). A "n/a" in a column means that the solver was unable to find all the solutions of the problem within two hours. It is shown that, our proposed technique contributing in decreasing of both function and jacobian evaluations and of pruning steps.

## 4 Conclusion

In this paper, we have proposed a new direction of research, merging combinatorial matching theory and a greedy based technique for obtaining a maximum transversal. Our future framework will be to access our technique to interval constraint solvers and devise more advanced structure-based heuristics.

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