

# Progress Report

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## 1 Summary

In the neural error correcting algorithm, so far we had assumed that the constraint matrix was given and all that is required is a message passing algorithm to correct the errors. Since we have found such an algorithm, the next step would be to find a way to determine the constraint matrix from a given data set that satisfy some constraints. This problem is closely related to finding the null basis of a linear code (the parity check matrix). However, not any such matrix is within our field of interest since we look for a sparse and expander parity check matrix. To find a method to help us obtain such matrices, we have started reading some papers on this topic the details of which are given below. Furthermore, we gave a talk on our work (entitled "Exponential Pattern Retrieval Capacity with Non-Binary Associative Memory") as an ALGO Seminar on June 29.

## 2 Null Space Problem

In [1], the authors propose an algorithm to find the a sparse null space to a given adjacency matrix. The algorithm uses complete matching to first identify non-zero positions in the null vectors of the matrix and then to solve a linear system of equations to find actual values of those non-zero elements. The authors have proposed two algorithms, one that computes a null space with an identity matrix as its part and the other one with a triangular matrix in it.

More formally, the problem of interest is to find a basis  $N$  for the null space of a  $t \times n$  matrix  $A$  with rank  $t$  that *has the fewest non-zero elements*. In other words, given  $A$ , the problem is to find a sparse matrix  $N$  such that  $AN = 0$ .

A null vector for  $A$  is a vector that  $Ax = 0$ . It corresponds to a *dependent set*, i.e. a set of columns in  $A$  that are linearly dependent. A minimal dependent set in  $A$  is called a *circuit*. The authors propose the following circuit finding algorithm which will be used later in order to solve the null space problem:

**Circuit finding algorithm:** If  $A$  is an adjacency matrix with Weak Hall Property (WHP) and a complete matching, then if  $u$  is an unmatched column-node (the nodes whose connectivity are represented by columns of  $A$ ) in  $A$ , by following all alternating paths, starting from  $u$  and ending in another column-node, after storing the end-point vertices one will have a dependent set which is minimal, i.e. we will have a circuit. This set is identified by the columns in  $A$  that the column-nodes in the dependent set represent. The corresponding dependent set is denoted by  $n(u)$ .

The reverse of the above algorithm is correct as well: *Every* circuit of a matrix  $A$  with WHP can be constructed by the circuit algorithm from some maximum matching of  $A$ . Using the above algorithm, **the fundamental null basis algorithm** is given below:

1. Let  $N$  be the empty set.
2. Find a complete matching of  $A$ ;
3. Partition the columns:  $A = [M-U]$ , where  $M$  is a non-singular matrix. rows and columns in  $M$  are matched together and represent the complete matching above.
4. For each  $u \in U$ :
  - Construct  $n(u)$  by the above circuit algorithm.

- Find the coefficients of the corresponding null vector for  $n(u)$ , i.e. the vector  $x$  for which  $n(u).x = 0$ .
- Add the obtained vector found above to  $N$ .

The authors have also proposed a similar algorithm that computes a basis with a triangular sub-matrix in it instead of the identity matrix as in the *fundamental null space*.

### 3 Conclusions and Future Works

One idea that was used by the authors to compute a matching in the fundamental null-space algorithm is to assign costs to each column, where the cost is the number of non-zero elements in that column. Then, for each row, one can match the corresponding row-column to the lowest cost *unmatched* column-node. In this way, we ensure to have a sparse null-space when we implement the fundamental null space algorithm on this matching. Such an idea might be useful in our algorithm, i.e. finding an expander parity check matrix of a linear code given its generator matrix.

### References

- [1] T. F. Coleman, A. Pothen, "The null space problem II. Algorithms", SIAM. J. on Algebraic and Discrete Methods, Vol. 8, No. 4, 1987, pp. 544-563.
- [2] T. F. Coleman, A. Pothen, "The null space problem I: complexity", SIAM. J. on Algebraic and Discrete Methods, Vol. 7, No. 4, 1986, pp. 527-537.