

implemented in this work. To preprocess the data, we used method compositions from the nibabel and nilearn libraries. To solve the problem, an overview of existing distributed systems was made, among which the Apache Spark framework was most effective. For the experiment, a cluster of 6 machines was taken, where the two machines were the main nodes, and 4 the workers. On the cluster, the minimum set of programs required for the experiment, such as YARN, HDFS, ZooKeeper, Spark and Zeppelin notebook was installed and configured.

A virtual experiment was performed in a distributed system. The time of this experiment was 4 hours for 400 GB of data. As a result of the experiment, matrices of connectivity between the brain regions of men and women were obtained, as well as a binary matrix of gender differences in functional connectivity.

Acknowledgments

This research was partially supported by the Russian Foundation for Basic Research (projects 15-29-06045, 16-07-01028).

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