

Case Study

Machine Learning
Intel® VTune™ Profiler

1.47x Speed-Up for Popular Machine Learning Library

intel software

Yandex optimizes the performance of CatBoost with Intel® VTune™ Profiler Hotspot Analysis

Yandex is the No. 1 Internet/cloud company in Russia and a strong contributor to machine learning and artificial intelligence worldwide. Its popular **CatBoost** is a high-performance, open source library for gradient boosting on decision trees.

When Yandex needed to identify performance bottlenecks in CatBoost, it collaborated with Intel's Software Development team, using **Intel® VTune™ Profiler** key debugging tools from the **Intel® oneAPI Base Toolkit** for hot spot analysis of the CatBoost framework on several datasets. By identifying bottlenecks, Yandex was able to speed up the performance of CatBoost by 1.47x on Intel® platforms

Efficient Machine Learning Models

Yandex researchers developed CatBoost for training and prediction on machine learning models. Yandex and other prominent companies, including CERN and Cloudflare, rely on CatBoost's features. Developers can cut the time they spend on parameter tuning using CatBoost's default parameters. To improve training results, CatBoost makes it possible to use non-numeric factors instead of having to pre-process data or spend time and effort turning it to numbers. Users can train their models on a fast implementation of a gradient-boosting algorithm. A model applier lets users apply their trained model quickly and efficiently, even to latency-critical tasks.

To maximize the value of CatBoost, Yandex needed to ensure that the performance on CPU bare metal or cloud is optimal. To ensure top performance, it used the Intel® Software Development tool Intel VTune Profiler.

Maximizing CatBoost's Performance

Yandex evaluated CatBoost's performance on several open-sourced datasets for Intel® CPU platforms including Intel® Xeon® and Xeon® Scalable processors (**Figures 1 and 2**).

Intel VTune Profiler analyzed the code, collecting key profiling data and presenting its findings through an interface that simplifies interpretation and helps developers focus on the most effective software optimizations, from computation and threading to memory and storage.

Yandex tested the training time of the datasets listed in the left in **Figure 1** and **Figure 2** and demonstrated the speed-up of these models with the optimizations suggested by Intel VTune Profiler

Intel VTune Profiler's hot spot analysis demonstrated issues with false sharing and extra atomic usage that were compromising memory access efficiency. By identifying bottlenecks, Yandex was able to speed up the performance of CatBoost by 1.47x.

Yandex

Finding Bottlenecks and Boosting Performance

This joint effort of the Intel and Yandex teams is helping data scientists train more complicated models and datasets faster on Intel platforms, and raising the popularity of the CatBoost machine learning library among the developer community. CatBoost's performance results will help data scientists around the world utilize their compute resources more efficiently and save on cloud resources.

Intel® Software tools proved effective for Yandex software developers and bring value for data scientists worldwide.

Learn More

- [Intel VTune Profiler >](#)
- [Intel oneAPI Base Toolkit >](#)

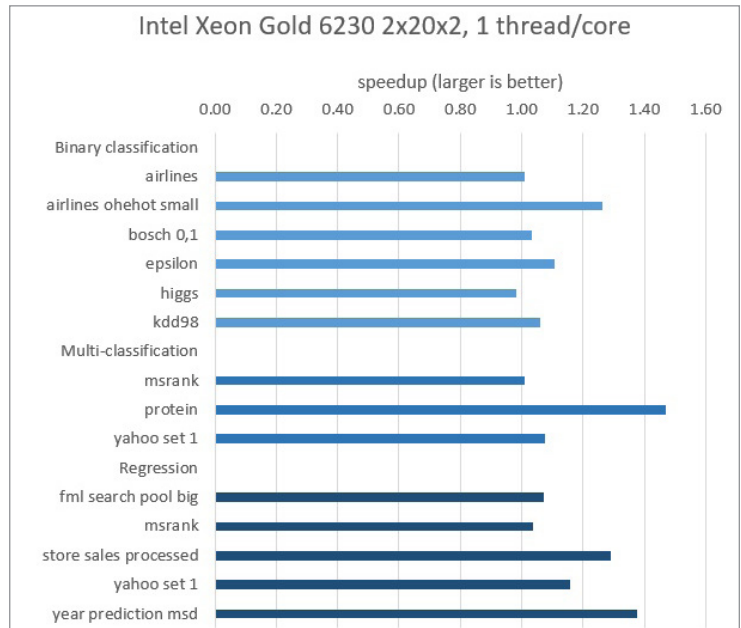


Figure 1. Intel Xeon processor 6230 used for training, 40 physical cores with 1 thread per physical core

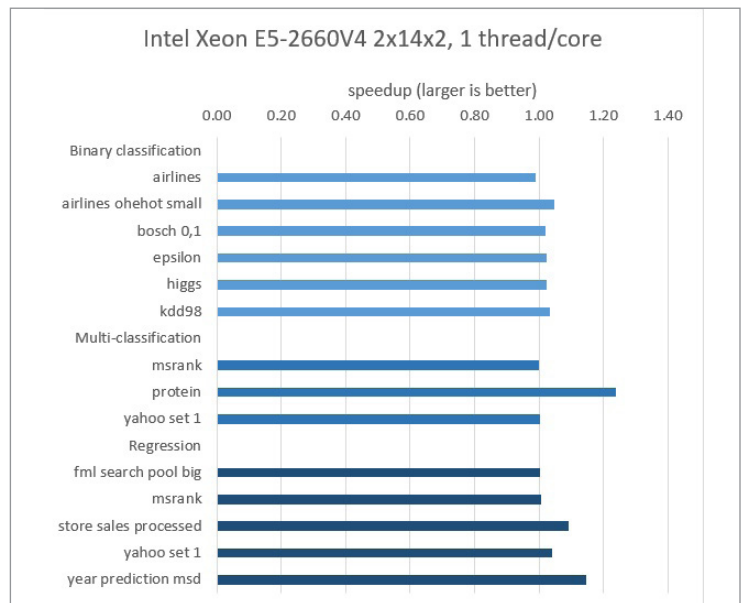


Figure 2. Intel Xeon processor E5-2660V4 with 2 sockets, 14 cores per socket, 2 HT per core, 1 thread per physical core



Intel technologies may require enabled hardware, software or service activation. Learn more at intel.com or from the OEM or retailer.

Your costs and results may vary.

Intel does not control or audit third-party data. You should consult other sources to evaluate accuracy.

Optimization Notice: Intel's compilers may or may not optimize to the same degree for non-Intel microprocessors for optimizations that are not unique to Intel microprocessors. These optimizations include SSE2, SSE3, and SSSE3 instruction sets and other optimizations. Intel does not guarantee the availability, functionality, or effectiveness of any optimization on microprocessors not manufactured by Intel. Microprocessor-dependent optimizations in this product are intended for use with Intel microprocessors. Certain optimizations not specific to Intel microarchitecture are reserved for Intel microprocessors. Please refer to the applicable product User and Reference Guides for more information regarding the specific instruction sets covered by this notice. Notice Revision #20110804. <https://software.intel.com/en-us/articles/optimization-notice>

Software and workloads used in performance tests may have been optimized for performance only on Intel microprocessors.

Performance tests, such as SYSmark and MobileMark, are measured using specific computer systems, components, software, operations and functions. Any change to any of those factors may cause the results to vary. You should consult other information and performance tests to assist you in fully evaluating your contemplated purchases, including the performance of that product when combined with other products. See backup for configuration details. For more complete information about performance and benchmark results, visit www.intel.com/benchmarks.

Performance results are based on testing as of dates shown in configurations and may not reflect all publicly available updates. See configuration disclosure for details. No product or component can be absolutely secure.

No license (express or implied, by estoppel or otherwise) to any intellectual property rights is granted by this document.

Intel disclaims all express and implied warranties, including without limitation, the implied warranties of merchantability, fitness for a particular purpose, and non-infringement, as well as any warranty arising from course of performance, course of dealing, or usage in trade.

© Intel Corporation. Intel, the Intel logo, and other Intel marks are trademarks of Intel Corporation or its subsidiaries. Other names and brands may be claimed as the property of others.

1220/SS