

```
// See README.md for usage instructions.
19
    #include "tensorflow/tools/benchmark/benchmark_model.h"
21
22
    #include <cstdlib>
23
    #include <memory>
24
    #include <string>
    #include <unordered_set>
26
    #include <vector>
28
    #include "tensorflow/core/framework/graph.pb.h"
    #include "tensorflow/core/framework/tensor.h"
31
    #include "tensorflow/core/graph/algorithm.h"
    #include "tensorflow/core/graph/graph.h"
    #include "tensorflow/core/graph/graph_constructor.h"
34
    #include "tensorflow/core/lib/strings/str_util.h"
    #include "tensorflow/core/lib/strings/strcat.h"
    #include "tensorflow/core/platform/env.h"
    #include "tensorflow/core/platform/init_main.h"
    #include "tensorflow/core/platform/logging.h"
    #include "tensorflow/core/platform/platform.h"
    #include "tensorflow/core/platform/types.h"
40
    #include "tensorflow/core/public/session.h"
41
    #include "tensorflow/core/util/command_line_flags.h"
42
    #include "tensorflow/core/util/reporter.h"
43
    #include "tensorflow/core/util/stat summarizer.h"
45
    namespace tensorflow {
46
47
    namespace benchmark_model {
48
49
    Status InitializeSession(int num_threads, const string& graph,
50
                              std::unique_ptr<Session>* session,
                              std::unique_ptr<GraphDef>* graph_def) {
51
      LOG(INFO) << "Loading TensorFlow.";
54
      tensorflow::SessionOptions options;
```

```
tensorflow::ConfigProto& config = options.config;
55
56
      if (num_threads > 0) {
57
        config.set_intra_op_parallelism_threads(num_threads);
58
      }
      LOG(INFO) << "Got config, " << config.device_count_size() << " devices";
59
60
      session->reset(tensorflow::NewSession(options));
61
62
      graph_def->reset(new GraphDef());
63
      tensorflow::GraphDef tensorflow_graph;
64
      Status s = ReadBinaryProto(Env::Default(), graph, graph_def->get());
65
      if (!s.ok()) {
        LOG(ERROR) << "Could not create TensorFlow Graph: " << s;
66
67
        return s;
68
      }
69
70
      s = (*session)->Create(*(graph_def->get()));
71
      if (!s.ok()) {
72
        LOG(ERROR) << "Could not create TensorFlow Session: " << s;
73
        return s;
74
      }
75
76
      return Status::OK();
77 }
78
    template <class T>
79
80
    void InitializeTensor(const std::vector<float>& initialization_values,
81
                           Tensor* input_tensor) {
      auto type_tensor = input_tensor->flat<T>();
82
83
      type_tensor = type_tensor.constant(0);
      if (!initialization_values.empty()) {
84
85
        for (int i = 0; i < initialization_values.size(); ++i) {</pre>
86
          type_tensor(i) = static_cast<T>(initialization_values[i]);
87
        }
88
      }
```

```
void CreateTensorsFromInputInfo(
 91
          const std::vector<InputLayerInfo>& inputs,
93
          std::vector<std::pair<string, tensorflow::Tensor> >* input_tensors) {
 94
       for (const InputLayerInfo& input : inputs) {
 95
         Tensor input_tensor(input.data_type, input.shape);
 96
          switch (input.data_type) {
 97
           case DT_INT32: {
              InitializeTensor<int32>(input.initialization_values, &input_tensor);
98
99
              break;
           }
            case DT_FLOAT: {
              InitializeTensor<float>(input.initialization_values, &input_tensor);
              break;
104
           }
            case DT_QUINT8: {
              InitializeTensor<quint8>(input.initialization_values, &input_tensor);
             break;
           }
            case DT_UINT8: {
110
              InitializeTensor<uint8>(input.initialization_values, &input_tensor);
111
             break;
112
            case DT_B00L: {
113
114
              InitializeTensor<bool>(input.initialization_values, &input_tensor);
115
             break;
116
           }
117
           case DT_STRING: {
             if (!input.initialization_values.empty()) {
118
119
                LOG(FATAL) << "Initialization values are not supported for strings";
             }
121
              auto type_tensor = input_tensor.flat<string>();
122
              type_tensor = type_tensor.constant("");
             break;
124
           }
            default:
126
              LOG(FATAL) << "Unsupported input type: "
```

```
127
                         << DataTypeString(input.data_type);</pre>
         }
128
129
         input_tensors->push_back({input.name, input_tensor});
       }
131
     }
     Status GetOutputShapes(const std::vector<InputLayerInfo>& inputs,
134
                             const std::set<string>& wanted_shapes, Session* session,
                             std::unordered_map<string, TensorShape>* node_shapes) {
136
       std::vector<std::pair<string, tensorflow::Tensor> > input_tensors;
137
       CreateTensorsFromInputInfo(inputs, &input_tensors);
138
       std::vector<tensorflow::Tensor> output_tensors;
139
       std::vector<string> output_tensor_names(wanted_shapes.begin(),
140
                                                wanted_shapes.end());
141
       TF_RETURN_IF_ERROR(
142
           session->Run(input_tensors, output_tensor_names, {}, &output_tensors));
143
       CHECK_EQ(output_tensors.size(), output_tensor_names.size());
144
       for (int i = 0; i < output_tensor_names.size(); ++i) {</pre>
         const string& wanted_shape_name = output_tensor_names[i];
         const TensorShape& found_shape = output_tensors[i].shape();
146
147
         (*node_shapes)[wanted_shape_name] = found_shape;
148
       }
149
       return Status::OK();
     Status CalculateFlops(const GraphDef& graph,
                            const std::vector<InputLayerInfo>& inputs,
                            Session* session, int64* total_flops,
154
                            std::unordered_map<string, int64>* flops_by_op) {
       std::unordered_set<string> floppable_ops = {
            "Conv2D", "MatMul", "QuantizedConv2D", "QuantizedMatMul"};
158
       std::set<string> wanted_shapes;
159
       for (const NodeDef& node : graph.node()) {
         if (floppable_ops.count(node.op())) {
           for (const string& input : node.input()) {
```

```
wanted_shapes.insert(input);
           }
164
           wanted_shapes.insert(node.name());
         }
       }
       std::unordered_map<string, TensorShape> found_shapes;
169
       TF_RETURN_IF_ERROR(
170
           GetOutputShapes(inputs, wanted_shapes, session, &found_shapes));
171
172
       *total_flops = 0;
173
       for (const NodeDef& node : graph.node()) {
174
         if (floppable_ops.count(node.op())) {
175
           int64 current_flops = 0;
176
           // This is a very crude approximation to FLOPs that only looks at a few
177
           // op types that commonly form the bulk of the computation for many
178
           // models. It's included here because getting even an approximate value
179
           // for FLOPs is still very useful for estimating utilization, versus a
           // device's theoretical maximum FLOPs/second.
           if ((node.op() == "Conv2D") || (node.op() == "QuantizedConv2D")) {
             const TensorShape& filter_shape = found_shapes[node.input(1)];
             const TensorShape& output_shape = found_shapes[node.name()];
184
             int64 filter_height = filter_shape.dim_size(0);
             int64 filter_width = filter_shape.dim_size(1);
             int64 filter_in_depth = filter_shape.dim_size(2);
187
             int64 output_count = output_shape.num_elements();
188
             current_flops =
                 output_count * filter_in_depth * filter_height * filter_width * 2;
           } else if ((node.op() == "MatMul") || (node.op() == "QuantizedMatMul")) {
191
             const bool transpose_a = node.attr().at("transpose_a").b();
             const TensorShape& a_shape = found_shapes[node.input(0)];
             const TensorShape& output_shape = found_shapes[node.name()];
194
             int64 k;
             if (transpose_a) {
               k = a\_shape.dim\_size(0);
             } else {
                k = a\_shape.dim\_size(1);
```

```
199
             }
              int64 output_count = output_shape.num_elements();
              current_flops = k * output_count * 2;
           }
            (*flops_by_op)[node.op()] += current_flops;
204
            *total_flops += current_flops;
         }
       }
206
       return Status::OK();
208
     }
     Status RunBenchmark(const std::vector<InputLayerInfo>& inputs,
211
                          const std::vector<string>& outputs, Session* session,
                          StatSummarizer* stats, int64* inference_time_us) {
       std::vector<std::pair<string, tensorflow::Tensor> > input_tensors;
213
214
       CreateTensorsFromInputInfo(inputs, &input_tensors);
216
       std::vector<tensorflow::Tensor> output_tensors;
217
218
       tensorflow::Status s;
219
       RunOptions run_options;
221
       if (stats != nullptr) {
         run_options.set_trace_level(RunOptions::FULL_TRACE);
223
       }
224
       RunMetadata run_metadata;
226
       const int64 start_time = Env::Default()->NowMicros();
227
       s = session->Run(run_options, input_tensors, outputs, {}, &output_tensors,
228
                         &run_metadata);
229
       const int64 end_time = Env::Default()->NowMicros();
        *inference_time_us = end_time - start_time;
231
       if (!s.ok()) {
         LOG(ERROR) << "Error during inference: " << s;
234
         return s;
```

```
}
       if (stats != nullptr) {
238
          assert(run_metadata.has_step_stats());
239
         const StepStats& step_stats = run_metadata.step_stats();
240
          stats->ProcessStepStats(step_stats);
       }
241
242
243
        return s;
244
     }
245
246
     Status TimeMultipleRuns(double sleep_seconds, int num_runs,
247
                              const std::vector<InputLayerInfo>& inputs,
248
                              const std::vector<string>& outputs, Session* session,
                              StatSummarizer* stats, int64* total_time_us) {
        // Convert the run_delay string into a timespec.
251
        timespec req;
252
        req.tv_sec = static_cast<time_t>(sleep_seconds);
253
        reg.tv_nsec = (sleep_seconds - reg.tv_sec) * 10000000000;
254
        *total_time_us = 0;
257
        LOG(INFO) << "Running benchmark for " << num_runs << " iterations "
258
                  << (stats != nullptr ? "with" : "without")</pre>
                  << " detailed stat logging:";
259
261
        Stat<int64> stat;
        for (int i = 0; i < num_runs; ++i) {</pre>
         int64 time;
          Status run_status = RunBenchmark(inputs, outputs, session, stats, &time);
264
          stat.UpdateStat(time);
266
          *total_time_us += time;
         if (!run_status.ok()) {
268
            LOG(INFO) << "Failed on run " << i;
269
            return run_status;
270
         }
```

```
271
         // If requested, sleep between runs for an arbitrary amount of time.
273
         // This can be helpful to determine the effect of mobile processor
274
         // scaling and thermal throttling.
275
         if (sleep_seconds > 0.0) {
276
     #ifdef PLATFORM_WINDOWS
277
            Sleep(sleep_seconds * 1000);
     #else
278
279
            nanosleep(&req, nullptr);
     #endif
         }
       }
       std::stringstream stream;
284
       stat.OutputToStream(&stream);
       LOG(INFO) << stream.str() << std::endl;</pre>
       return Status::OK();
288
     }
     int Main(int argc, char** argv) {
       string graph = "/data/local/tmp/tensorflow_inception_graph.pb";
       string input_layer_string = "input:0";
       string input_layer_shape_string = "1,224,224,3";
294
       string input_layer_type_string = "float";
       string input_layer_values_string = "";
       string output_layer_string = "output:0";
       int num_runs = 50;
298
       string run_delay = "-1.0";
299
       int num_threads = -1;
       string benchmark_name = "";
       string output_prefix = "";
       bool show_sizes = false;
       bool show_run_order = true;
304
       int run_order_limit = 0;
       bool show_time = true;
306
       int time_limit = 10;
```

```
bool show_memory = true;
308
       int memory_limit = 10;
       bool show_type = true;
       bool show_summary = true;
311
       bool show_flops = false;
       int warmup_runs = 2;
314
       std::vector<Flag> flag_list = {
315
           Flag("graph", &graph, "graph file name"),
316
           Flag("input_layer", &input_layer_string, "input layer names"),
           Flag("input_layer_shape", &input_layer_shape_string, "input layer shape"),
318
           Flag("input_layer_type", &input_layer_type_string, "input layer type"),
           Flag("input_layer_values", &input_layer_values_string,
                "values to initialize the inputs with"),
321
           Flag("output_layer", &output_layer_string, "output layer name"),
           Flag("num_runs", &num_runs, "number of runs"),
           Flag("run_delay", &run_delay, "delay between runs in seconds"),
324
           Flag("num_threads", &num_threads, "number of threads"),
           Flag("benchmark_name", &benchmark_name, "benchmark name"),
326
           Flag("output_prefix", &output_prefix, "benchmark output prefix"),
           Flag("show_sizes", &show_sizes, "whether to show sizes"),
328
           Flag("show_run_order", &show_run_order,
                 "whether to list stats by run order"),
           Flag("run_order_limit", &run_order_limit,
                 "how many items to show by run order"),
           Flag("show_time", &show_time, "whether to list stats by time taken"),
           Flag("time_limit", &time_limit, "how many items to show by time taken"),
           Flag("show_memory", &show_memory, "whether to list stats by memory used"),
334
           Flag("memory_limit", &memory_limit,
                 "how many items to show by memory used"),
           Flag("show_type", &show_time, "whether to list stats by op type"),
338
           Flag("show_summary", &show_time,
                "whether to show a summary of the stats"),
           Flag("show_flops", &show_flops, "whether to estimate the model's FLOPs"),
341
           Flag("warmup_runs", &warmup_runs, "how many runs to initialize model"),
       };
```

```
343
       string usage = Flags::Usage(argv[0], flag_list);
344
       const bool parse_result = Flags::Parse(&argc, argv, flag_list);
       if (!parse_result) {
         LOG(ERROR) << usage;
348
         return -1;
       }
349
350
351
       std::vector<string> input_layers = str_util::Split(input_layer_string, ',');
       std::vector<string> input_layer_shapes =
            str_util::Split(input_layer_shape_string, ':');
354
       std::vector<string> input_layer_types =
            str_util::Split(input_layer_type_string, ',');
356
       std::vector<string> input_layer_values =
            str_util::Split(input_layer_values_string, ':');
358
       std::vector<string> output_layers = str_util::Split(output_layer_string, ',');
       if ((input_layers.size() != input_layer_shapes.size()) ||
359
            (input_layers.size() != input_layer_types.size())) {
         LOG(ERROR) << "There must be the same number of items in --input_layer,"
361
                     << " --input_layer_shape, and --input_layer_type, for example"
                     << " --input_layer=input1,input2 --input_layer_type=float,float "</pre>
364
                     << " --input_layer_shape=1,224,224,4:1,20";</pre>
          LOG(ERROR) << "--input_layer=" << input_layer_string << " ("
                     << input_layers.size() << " items)";</pre>
          LOG(ERROR) << "--input_layer_type=" << input_layer_type_string << " ("
367
368
                     << input_layer_types.size() << " items)";</pre>
369
         LOG(ERROR) << "--input_layer_shape=" << input_layer_shape_string << " ("
                     << input_layer_shapes.size() << " items)";</pre>
371
         return -1;
372
       }
373
       const size_t inputs_count = input_layers.size();
374
375
        ::tensorflow::port::InitMain(argv[0], &argc, &argv);
376
       if (argc > 1) {
         LOG(ERROR) << "Unknown argument " << argv[1] << "\n" << usage;
378
         return -1;
```

```
379
       }
381
       LOG(INFO) << "Graph: [" << graph << "]";
       LOG(INFO) << "Input layers: [" << input_layer_string << "]";</pre>
       LOG(INFO) << "Input shapes: [" << input_layer_shape_string << "]";
384
       LOG(INFO) << "Input types: [" << input_layer_type_string << "]";</pre>
       LOG(INFO) << "Output layers: [" << output_layer_string << "]";
       LOG(INFO) << "Num runs: [" << num_runs << "]";
387
       LOG(INFO) << "Inter-run delay (seconds): [" << run_delay << "]";
388
       LOG(INFO) << "Num threads: [" << num_threads << "]";
       LOG(INFO) << "Benchmark name: [" << benchmark_name << "]";
       LOG(INFO) << "Output prefix: [" << output_prefix << "]";
391
       LOG(INFO) << "Show sizes: [" << show_sizes << "]";
       LOG(INFO) << "Warmup runs: [" << warmup_runs << "]";
394
       std::unique_ptr<Session> session;
       std::unique_ptr<StatSummarizer> stats;
       std::unique_ptr<GraphDef> graph_def;
       Status initialize_status =
398
           InitializeSession(num_threads, graph, &session, &graph_def);
       if (!initialize_status.ok()) {
400
         return -1;
       }
401
403
       StatSummarizerOptions stats_options;
404
       stats_options.show_run_order = show_run_order;
405
       stats_options.run_order_limit = run_order_limit;
       stats_options.show_time = show_time;
406
       stats_options.time_limit = time_limit;
408
       stats_options.show_memory = show_memory;
409
       stats_options.memory_limit = memory_limit;
410
       stats_options.show_type = show_type;
411
       stats_options.show_summary = show_summary;
412
       stats.reset(new tensorflow::StatSummarizer(stats_options));
413
       const double sleep_seconds = std::strtod(run_delay.c_str(), nullptr);
414
```

```
415
416
        std::vector<InputLayerInfo> inputs;
417
        for (int n = 0; n < inputs_count; ++n) {</pre>
418
          InputLayerInfo input;
419
          CHECK(DataTypeFromString(input_layer_types[n], &input.data_type))
420
              << input_layer_types[n] << " was an invalid type";</pre>
421
          std::vector<int32> sizes;
422
          CHECK(str_util::SplitAndParseAsInts(input_layer_shapes[n], ',', &sizes))
423
              << "Incorrect size string specified: " << input_layer_shapes[n];</pre>
424
          for (int i = 0; i < sizes.size(); ++i) {</pre>
425
            input.shape.AddDim(sizes[i]);
426
         }
427
          input.name = input_layers[n];
428
          if (n < input_layer_values.size()) {</pre>
            CHECK(str_util::SplitAndParseAsFloats(input_layer_values[n], ',',
429
430
                                                    &input.initialization_values))
                << "Incorrect initialization values string specified: "</pre>
431
432
                << input_layer_values[n];</pre>
         }
433
434
          inputs.push_back(input);
435
       }
436
437
        // If requested, run through the graph first to preinitialize everything
438
        // before the benchmarking runs.
439
        int64 warmup_time_us = 0;
440
        if (warmup_runs > 0) {
441
          Status warmup_time_status =
442
              TimeMultipleRuns(sleep_seconds, warmup_runs, inputs, output_layers,
443
                                session.get(), nullptr, &warmup_time_us);
444
         if (!warmup_time_status.ok()) {
445
            LOG(ERROR) << "Timing failed with " << warmup_time_status;</pre>
446
            return -1;
         }
447
448
       }
449
450
        // Capture overall inference time without stat logging overhead. This is the
```

```
451
       // timing data that can be compared to other libaries.
452
       int64 no_stat_time_us = 0;
453
       Status no_stat_time_status =
454
            TimeMultipleRuns(sleep_seconds, num_runs, inputs, output_layers,
455
                             session.get(), nullptr, &no_stat_time_us);
456
       const double no_stat_wall_time = no_stat_time_us / 1000000.0;
457
       if (!no_stat_time_status.ok()) {
         LOG(ERROR) << "Timing failed with " << no_stat_time_status;</pre>
458
459
         return -1;
       }
461
462
       // Run again to gather detailed log stats to get a better idea of where
       // relative time is going within the graph.
464
       int64 stat_time_us = 0;
       Status stat_time_status =
466
            TimeMultipleRuns(sleep_seconds, num_runs, inputs, output_layers,
467
                             session.get(), stats.get(), &stat_time_us);
       if (!stat_time_status.ok()) {
         LOG(ERROR) << "Timing failed with " << stat_time_status;
470
         return -1;
471
       }
472
473
       LOG(INFO) << "Average inference timings in us: "
474
                  << "Warmup: "
475
                  << (warmup_runs > 0 ? warmup_time_us / warmup_runs : 0) << ", "</pre>
                  << "no stats: " << no_stat_time_us / num_runs << ", "
476
477
                  << "with stats: " << stat_time_us / num_runs;</pre>
478
479
       stats->PrintStepStats();
480
481
       if (show_sizes) {
         stats->PrintOutputs();
483
       }
484
485
       if (show_flops) {
         int64 total_flops;
```

```
487
         std::unordered_map<string, int64> flops_by_op;
488
         Status flop_status = CalculateFlops(*graph_def, inputs, session.get(),
489
                                              &total_flops, &flops_by_op);
         if (!flop_status.ok()) {
491
           LOG(ERROR) << "FLOPs calculation failed with " << flop_status;
492
           return -1;
         }
493
         string pretty_flops;
494
         if (total_flops < 1000) {</pre>
495
496
            pretty_flops = strings::StrCat(total_flops, " FLOPs");
         } else if (total_flops < (1000 * 1000)) {</pre>
497
498
            const float rounded_flops = (total_flops / 1000.0f);
            pretty_flops = strings::StrCat(rounded_flops, "k FLOPs");
         } else if (total_flops < (1000 * 1000 * 1000)) {</pre>
            const float rounded_flops = round(total_flops / 1000.0f) / 1000.0f;
            pretty_flops = strings::StrCat(rounded_flops, " million FLOPs");
         } else {
            const float rounded_flops =
504
                round(total_flops / (1000.0f * 1000.0f)) / 1000.0f;
           pretty_flops = strings::StrCat(rounded_flops, " billion FLOPs");
         }
508
         LOG(INFO) << "FLOPs estimate: " << strings::HumanReadableNum(total_flops);</pre>
         const double mean_run_time = no_stat_wall_time / num_runs;
510
         LOG(INFO) << "FLOPs/second: "
511
                    << strings::HumanReadableNum(
                           static_cast<int64>(total_flops / mean_run_time));
513
       }
514
515
       if (!benchmark_name.empty() && !output_prefix.empty()) {
516
         // Compute the total number of values per input.
         int64 total_size = inputs[0].shape.num_elements();
518
519
         // Throughput in MB/s
         const double throughput =
521
              DataTypeSize(inputs[0].data_type) * total_size * num_runs /
522
              static_cast<double>(no_stat_wall_time) / (1024 * 1024);
```

```
523
         // Report the stats.
524
525
         TestReporter reporter(output_prefix, benchmark_name);
526
         TF_QCHECK_OK(reporter.Initialize());
527
         TF_QCHECK_OK(
528
             reporter.Benchmark(num_runs, -1.0, no_stat_wall_time, throughput));
         TF_QCHECK_OK(reporter.Close());
529
530
       }
531
532
       return 0;
533
     }
534
     } // namespace benchmark_model
536
     } // namespace tensorflow
```

© 2017 GitHub, Inc. Terms Privacy Security Status Help



Contact GitHub API Training Shop Blog About