## LLAMA

#### Background

- To investigate the runtime complexity of large language models with almost minimal embeddings
- Prompt used: "Hello who is this"
- 8.50GB of RAM allocated for this process
- Both models are 7B (quantized)
- TXT file with embeddings: "The test"

model	original size	quantized size (4-bit)
7B	13 GB	3.9 GB
13B	24 GB	7.8 GB
30B	60 GB	19.5 GB
65B	120 GB	38.5 GB

#### Methodology

- The models were loaded and installed from the local environment (Macbook 13 inch
- ARM processor
- 8 cores, 8 thread CPU
- Integrated GPU
- 16 GB total RAM
- 2. The models were then used on the set prompt "Hello who is this"
- 3. The models had access to embeddings which contained almost nothing, it only contains 2 words: "The test"
- 4. The runtimes were compared and the results evaluated

# GPT4ALL (gpt4all-lora-quantized-ggml)

- This model is directly imported from GPT4ALL libraries with pre trained weights.
- Uses the **old ggml format**

# Converted GPT4ALL model (ggml-q4-0)

- We converted the earlier model using LLAMA's libraries:
- <a href="https://github.com/ggerganov/llama.cpp">https://github.com/ggerganov/llama.cpp</a>
- This model should be more optimised with the new ggml format

### Comparison

GPT4ALL	Converted
<ul> <li>Significantly higher (40%) mean and standard deviation for request and response total time</li> <li>Slightly more runs for response sample time (24.6ms) and evaluation response time (23.6ms)</li> <li>Request times had a lower standard deviation</li> </ul>	<ul> <li>Significantly lower         (40%) mean and         standard deviation for         request and response         total time</li> <li>Slightly fewer runs for         response sample time         (22.2ms) and evaluation         response time (21.2ms)</li> <li>Request times had a         higher standard         deviation</li> </ul>

# Appendix - gpt4all-lora-quantized-ggml

lama\_print\_timings:

load time = 9449.59 ms

```
llama_print_timings:
                                                                                                    load time = 9668.23 ms
                           load time = 9728.69 ms
llama print timings:
                                                                                                                                                                                    sample time =
                                                                                                                                                                                                                     1 runs (
                                                                                                                                                          lama_print_timings:
                                                                                                                                                                                                      0.00 ms /
                                                                         llama print timings:
                                                                                                  sample time =
                                                                                                                   0.00 ms /
                                                                                                                                 1 runs
                                                                                                                                              0.00 ms per
llama_print_timings:
                         sample time =
                                           0.00 ms /
                                                        1 runs
                                                                                                                                                           .00 ms per run)
0.00 ms per run)
                                                                                                                                                          lama print timings: prompt eval time =
                                                                                                                                                                                                   9431.44 ms
                                                                                                                                                                                                                     5 tokens ( 188
                                                                                                                                 5 tokens ( 1930.20 ms per
                                                                         llama_print_timings: prompt eval time =
llama_print_timings: prompt eval time =
                                       9699.52 ms /
                                                        5 tokens ( 193
                                                                                                                                                           .29 ms per token)
                                                                         token)
9.90 ms per token)
                                                                                                                                                          lama print timings:
                                                                                                                                                                                      eval time =
                                                                                                                                                                                                      0.00 ms /
                                                                                                                                                                                                                     1 runs
                                                                         llama_print_timings:
                                                                                                                   0.00 ms /
                                                                                                                                              0.00 ms per
                                                        1 runs (
llama print timings:
                           eval time =
                                           0.00 ms /
                                                                                                                                                           .00 ms per run)
0.00 ms per run)
                                                                                                   total time = 9671.07 ms
                                                                                                                                                          lama_print_timings:
                                                                                                                                                                                     total time = 9454.09 ms
                                                                         llama print timings:
llama_print_timings:
                          total time = 9732.85 ms
                                                                          llama print timings:
                                                                                                    load time = 15126.91 \text{ ms}
                                                                                                                                                                                      load time = 14177.34 ms
                                                                                                                                                          lama_print_timings:
llama print timings:
                           load time = 12335.29 ms
                                                                         llama print timings:
                                                                                                  sample time = 110.95 ms /
                                                                                                                                38 runs
                                                                                                                                             2.92 ms per lama_print_timings:
                                                                                                                                                                                    sample time = 78.47 \text{ ms} /
                                                                                                                                                                                                                    25 runs
llama print timings:
                         sample time =
                                         50.02 ms /
                                                       19 runs
                                                                                                                                                          .14 ms per run)
2.63 ms per run)
                                                                         llama print timings: prompt eval time = 91640.34 ms
                                                                                                                                60 tokens ( 1527.34 ms per
                                                                                                                                                          lama print timings: prompt eval time = 99475.00 ms /
                                                                                                                                                                                                                    60 tokens ( 165
llama_print_timings: prompt eval time = 90098.86 ms
                                                       60 tokens ( 150
                                                                         token)
                                                                                                                                                           .92 ms per token)
1.65 ms per token)
                                                                                                    eval time = 84847.47 ms /
                                                                                                                                        ( 2293.17 ms per
                                                                         llama print timings:
                                                                                                                                37 runs
                                                                                                                                                          lama print timings:
                                                                                                                                                                                      eval time = 60698.71 ms /
                                                                                                                                                                                                                    24 runs ( 252
                           eval time = 33744.35 ms /
llama print timings:
                                                       18 runs ( 187
                                                                          run)
4.69 ms per run)
                                                                                                                                                          .11 ms per run)
                                                                         llama print timings:
                                                                                                   total time = 176635.84 ms
                                                                                                                                                                                     total time = 160293.65 ms
                                                                                                                                                          lama print timings:
llama print timings:
                          total time = 123916.71 ms
                                                                          this could be anyone on your contacts list or from a unknown source
                                                                         Contextual Answer: This is in reference to the phone call and the user is unsure of It would be great if we could find out who this caller is and connect t
This is a helpful answer that may or may not have any relevance to your
question.
                                                                                                                                                          em with our department representative for further assistance.
                                                                         who it is from
                                                                                           llama print timings:
                                                                                                                           load time = 8954.98 ms
                              load time = 9823.52 ms
llama print timings:
                                                                                           llama print timings:
                                                                                                                        sample time =
                                                                                                                                            0.00 ms /
                                                                                                                                                           1 runs
                                                                                                                                                                           0.00 ms per
                            sample time =
 llama print timings:
                                               0.00 ms /
                                                             1 runs
                                                                            0.00 ms per
                                                                                           run)
                                                                                           llama print timings: prompt eval time = 8953.05 ms /
                                                                                                                                                           5 tokens ( 1790.61 ms per
                                                              5 tokens ( 1961.42 ms per
 llama print timings: prompt eval time = 9807.09 ms /
                                                                                           token)
 token)
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                                                                                                                                            0.00 ms /
                                                                                                                                                           1 runs
                                                                                                                          eval time =
                                                                                                                                                                           0.00 ms per
 llama print timings:
                              eval time =
                                               0.00 ms /
                                                                            0.00 ms per
                                                                                                                         total time = 8955.90 ms
                                                                                           llama_print_timings:
llama_print_timings:
                             total time = 9824.84 \text{ ms}
                                                                                           llama print timings:
                                                                                                                           load time = 11267.34 ms
 llama print timings:
                              load time = 15429.89 \text{ ms}
                                                                                           llama print timings:
                                                                                                                        sample time =
                                                                                                                                           42.24 ms /
                                                                                                                                                          20 runs
                                                                                                                                                                           2.11 ms per
                                                                                           run)
llama print timings:
                            sample time =
                                             51.29 ms /
                                                            21 runs
                                                                            2.44 ms per
                                                                                           llama print timings: prompt eval time = 74216.49 ms /
                                                                                                                                                          60 tokens ( 1236.94 ms per
run)
                                                                                           token)
 <u>llama print t</u>imings: prompt eval time = 88659.09 ms /
                                                             60 tokens ( 1477.65 ms per
                                                                                           llama print timings:
                                                                                                                          eval time = 20861.60 ms /
                                                                                                                                                          19 runs
                                                                                                                                                                     ( 1097.98 ms per
 token)
                                                                                           run)
                              eval time = 32436.31 ms /
llama print timings:
                                                                      ( 1621.82 ms per
                                                                                           llama print timings:
                                                                                                                         total time = 95127.52 ms
 run)
                                                                                            This is a useful piece of information for the purpose of answering questions about
 llama_print_timings:
                             total time = 121179.89 ms
                                                                                           yourself or your identity.
  I am a human being and I
                            have emotions like happiness, sadness, anger or fear.
```

#### Appendix - ggml-q4-0

```
llama print timings:
                                                                                                                                                       load time = 8819.79 ms
                                                                                                               llama print timings:
                                                                                                                                                   sample time =
                                                                                                                                                                            0.00 ms /
                                                                                                                                                                                                1 runs
                                                                                                                                                                                                                    0.00 ms per
                                    load time = 6959.78 ms
llama print timings:
                                                                                                                                                                                                                                        llama print timings:
                                                                                                                                                                                                                                                                               load time = 5077.15 ms
llama_print_timings:
                                 sample time = 0.00 ms /
                                                                          1 runs ( 0.00 ms per
                                                                                                                                                                                                                                                                             sample time =
                                                                                                                                                                                                                                                                                                     0.00 ms /
                                                                                                                                                                                                                                        llama print timings:
                                                                                                                                                                                                                                                                                                                          1 runs (
                                                                                                                                                                                                                                                                                                                                              0.00 ms per
                                                                                                               llama print timings: prompt eval time = 8819.51 ms /
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llama print timings: prompt eval time = 6959.48 ms /
                                                                          5 tokens ( 1391.90 ms per
                                                                                                                                                                                                                                        llama print timings: prompt eval time = 5076.90 ms /
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                                                                                                               llama print timings:
                                                                                                                                                      eval time =
                                                                                                                                                                             0.00 ms /
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                                                                                                                                                                                                                    0.00 ms per
token)
                                                        0.00 ms /
llama print timings:
                                   eval time =
                                                                          1 runs ( 0.00 ms per
                                                                                                                                                                                                                                        llama print timings:
                                                                                                                                                                                                                                                                               eval time =
                                                                                                                                                                                                                                                                                                      0.00 ms /
                                                                                                               llama_print_timings:
                                                                                                                                                     total time = 8820.15 ms
run)
llama print timings:
                                  total time = 6960.05 ms
                                                                                                                                                                                                                                       llama_print_timings:
                                                                                                                                                                                                                                                                              total time = 5077.43 ms
                                                                                                               llama print timings:
                                                                                                                                                      load time = 8872.83 \text{ ms}
llama print timings:
                                   load time = 8333.86 ms
                                                                                                                                                                                                                                       llama print timings:
                                                                                                                                                                                                                                                                               load time = 7503.65 ms
                                                                                                                                                                                                                   1.98 ms per
                                                                                                               llama_print_timings:
                                                                                                                                                   sample time = 65.40 ms /
                                                                                                                                                                                               33 runs (
                                                                                                                                                                                                                                        llama_print_timings:
llama print timings:
                                 sample time = 50.26 ms /
                                                                         23 runs ( 2.19 ms per
                                                                                                                                                                                                                                                                             sample time = 48.64 ms /
                                                                                                                                                                                                                                                                                                                        24 runs
                                                                                                                                                                                                                                                                                                                                             2.03 ms per
run)
                                                                                                               llama print timings: prompt eval time = 54647.47 ms /
llama_print_timings: prompt eval time = 55886.79 ms
                                                                          60 tokens ( 931.45 ms per
                                                                                                                                                                                                                                        llama print timings: prompt eval time = 53616.67 ms /
                                                                                                                                                                                                                                                                                                                         60 tokens ( 893,61 ms per
token)
                                                                                                               llama_print_timings:
                                                                                                                                                      eval time = 30874.97 ms /
                                                                                                                                                                                               32 runs ( 964.84 ms per
                                                                                                                                                                                                                                       llama print timings:
                                                                                                                                                                                                                                                                               eval time = 23134.91 ms /
llama print timings:
                                                                         22 runs ( 973.54 ms per
                                                                                                                                                                                                                                                                                                                        23 runs ( 1005.87 ms per
                                                                                                               run)
run)
                                                                                                               llama print timings:
                                                                                                                                                     total time = 85594.56 ms
                                                                                                                                                                                                                                        llama print timings:
                                                                                                                                                                                                                                                                              total time = 76805.32 \text{ ms}
llama print timings:
                                  total time = 77384.43 ms
This sounds like a technical support call. Can you please provide your email ID and I am not sure what your question is, but if you are looking for assistance with a t You are speaking with a virtual assistant or AI program and can ask it questions about 1 am not sure what your question is, but if you are looking for assistance with a t You are speaking with a virtual assistant or AI program and can ask it questions about 1 am not sure what your question is, but if you are looking for assistance with a t You are speaking with a virtual assistant or AI program and can ask it questions about 1 am not sure what your question is, but if you are looking for assistance with a t You are speaking with a virtual assistant or AI program and can ask it questions about 1 am not sure what your question is, but if you are looking for assistance with a t You are speaking with a virtual assistant or AI program and can ask it questions about 1 am not sure what you are looking for assistance with a time of the your question is a sure what you are speaking with a virtual assistance with
                                                                                                               echnical issue, please provide more information so we can help you better.
                                                                                                                                                                                                                                        out the company or service it represents
we can assist you further?
                                                                                                                                            llama print timings:
                                                                                                                                                                                        load time = 9338.70 \text{ ms}
 llama_print_timings:
                                                     load time = 10666.44 ms
                                                                                                                                            llama print timings:
                                                                                                                                                                                     sample time =
                                                                                                                                                                                                                 0.00 ms /
                                                                                                                                                                                                                                       1 runs
                                                                                                                                                                                                                                                             0.00 ms per
 llama print timings:
                                                 sample time =
                                                                                   0.00 ms /
                                                                                                             1 runs
 0.00 ms per run)
                                                                                                                                            run)
                                                                                                             5 tokens ( 213
                                                                                                                                           llama print timings: prompt eval time = 9338.52 ms /
                                                                                                                                                                                                                                       5 tokens ( 1867.70 ms per
 llama print timings: prompt eval time = 10666.15 ms /
 3.23 ms per token)
 llama print timings:
                                                                                                                                            llama print timings:
                                                                                                                                                                                        eval time =
                                                                                                                                                                                                                0.00 ms /
                                                                                                                                                                                                                                       1 runs
                                                                                                                                                                                                                                                             0.00 ms per
                                                     eval time =
                                                                                   0.00 ms /
                                                                                                             1 runs
 0.00 ms per run)
                                                                                                                                            run)
 llama_print_timings:
                                                   total time = 10667.39 ms
                                                                                                                                            llama print timings:
                                                                                                                                                                                       total time = 9339.13 ms
 llama print timings:
                                                     load time = 8718.09 \text{ ms}
                                                                                                                                            llama print timings:
                                                                                                                                                                                        load time = 9069.83 \text{ ms}
 llama print timings:
                                                 sample time =
                                                                                41.47 ms /
                                                                                                           15 runs
                                                                                                                                            llama print timings:
                                                                                                                                                                                    sample time = 32.72 ms /
                                                                                                                                                                                                                                     16 runs
                                                                                                                                                                                                                                                             2.04 ms per
 2.76 ms per run)
                                                                                                                                            run)
 llama print timings: prompt eval time = 66342.26 ms /
                                                                                                           60 tokens ( 110
                                                                                                                                           llama print timings: prompt eval time = 54920.62 ms /
                                                                                                                                                                                                                                      60 tokens
                                                                                                                                                                                                                                                          915.34 ms per
 5.70 ms per token)
                                                                                                                                            token)
 llama print timings:
                                                     eval time = 22934.44 ms /
                                                                                                           14 runs
                                                                                                                              ( 163
                                                                                                                                           llama print timings:
                                                                                                                                                                                        eval time = 14208.23 ms /
                                                                                                                                                                                                                                     15 runs
                                                                                                                                                                                                                                                          947.22 ms per
 8.17 ms per run)
                                                                                                                                            run)
                                                    total time = 89329.92 ms
 llama print timings:
                                                                                                                                            llama print timings:
                                                                                                                                                                                       total time = 69164.91 ms
  This is XYZ Company. Can I help you with anything?
                                                                                                                                            This is an automated system. Can I assist you with anything else?
```