生成加速

I.webUI加速

0. 基准速度: stable diffusion webUI 框架生成耗时(条件逐行增加):

| | 尺寸 | 采样器 | 步数 | LoRA | Cont rolNe t | Latent Couple | 速度 (约) | sdp- attenti on | &chann elslast | Dogget tx |
|----------------------|--------------|------------------------|----|------------|--------------------|------------------|-----------------------|-----------------------|-------------------|-------------------|
| 基准 | 512x 512 | Euler | 20 | 无 | 无 | 无 | 17.7it/s 、1.1s | | | |
| 尺寸 | 1024 x768 | | | | | | 5.6it/s 、 3.5s | | | |
| 采样器 | | DPM++ SDE Karras | | | | | 2.8it/s 、7.1s | | | |
| 步数 | | | 30 | | | | 2.8it/s 10.7s | 5.5it/s 、5.4s | 5.8it/s 、5.2s | |
| LoRA | | | | coupl e | | | 2.8it/s 10.7s | 5.5it/s 、5.4s | 5.8it/s 、5.2s | |
| Contr olNet 1 | | | | | Seg | | 2.0it/s 15.0s | 3.9it/s 、7.7s | 4.3it/s 、7.0s | |
| Contr olNet 2 | | | | | Pose | | 1.6it/s 、 18.7s | 3.3it/s 、9.1s | 3.4it/s 、8.8s | 1.6it/s 、18.7s |
| Latent Coupl e | | | | | | rectan gle | 0.8it/s 、 37.4s | 1.7it/s 、17.2s | 1.7it/s 、17.2s | |

webUI 性能 benchmark 网站: https://vladmandic.github.io/sd-extension-system-info/pages/benchmark.html

1. webUI 加速:现有工具

```
("--xformers", action='store_true', help="enable xformers for cross attention layers")
("--force-enable-xformers", action='store_true', help="enable xformers for cross attention layers regardless of whether the checking code thinks you can run it; do not make bug ("--xformers-flash-attention", action='store_true', help="enable xformers with Flash Attention to improve reproducibility (supported for SD2.x or variant only)")
("--opt-split-attention", action='store_true', help="prefer Doggettx's cross-attention layer optimization for automatic choice of optimization")
("--opt-split-attention", action='store_true', help="prefer Doggettx's cross-attention layer optimization for automatic choice of optimization")
("--sub-quad-attention", action='store_true', help="prefer memory efficient sub-quadratic cross-attention layer optimization for automatic choice of optimization")
("--sub-quad-chunk-size", type=int, help="query chunk size for the sub-quadratic cross-attention layer optimization to use", default=1024)
("--sub-quad-chunk-threshold", type=int, help="the percentage of VRAM threshold for the sub-quadratic cross-attention layer optimization to use chunking", default=None)
("--opt-split-attention-invokeai", action='store_true', help="prefer InvokeAI's cross-attention layer optimization for automatic choice of optimization")
("--opt-split-attention-v1", action='store_true', help="prefer scaled dot product cross-attention layer optimization for automatic choice of optimization")
("--opt-sdp-no-mem-attention", action='store_true', help="prefer scaled dot product cross-attention layer optimization without memory efficient attention for automatic choice of optimization for automatic choice of optimization")
```

webUI 已经集成了多种类型的加速库

目前公认加速效果最好的是 torch2.x+cu118+sdp, 比正常推理方案提速一倍

reference: https://www.reddit.com/r/StableDiffusion/comments/y71q5k/comment/jcm67lu/? utm_source=share&utm_medium=web2x&context=3

2. 加速原理:

现有的加速工具都是对 transformer 部分进行加速(cnn 部分已经做的很好了,[4k,4k] 输入的 UNet 在 4090 上的耗时也不会超过 0.5s),而 transformer 部分包含多个组件:如 Linear、scaled dotproduct、LayerNorm 等等,加速一般从内存机制(如何使得各组件之间的 tensor 读写更加合理)、高效 FLOPS(融合某些相邻层权重)、量化等。

以 xformer 为例,做了如下优化:

Key Features

- 1. Many attention mechanisms, interchangeables
- 2. Optimized building blocks, beyond PyTorch primitives
 - i. Memory-efficient exact attention up to 10x faster
 - ii. sparse attention
 - iii. block-sparse attention
 - iv. fused softmax
 - v. fused linear layer
 - vi. fused layer norm
 - vii. fused dropout(activation(x+bias))
 - viii. fused SwiGLU
- 3. Benchmarking and testing tools
 - i. micro benchnmarks
 - ii. transformer block benchmark
 - iii. LRA, with SLURM support
- 4. Programatic and sweep friendly layer and model construction
 - i. Compatible with hierarchical Transformers, like Swin or Metaformer
- 5. Hackable
 - i. Not using monolithic CUDA kernels, composable building blocks
 - ii. Using Triton for some optimized parts, explicit, pythonic and user-accessible
 - iii. Native support for SquaredReLU (on top of ReLU, LeakyReLU, GeLU, ..), extensible activations

from: https://github.com/facebookresearch/xformers#key-features

II. diffusers 加速

(先按之前看到的加速方案开一些可能的脑洞, 还未尝试)

- 1. text_encoder 参数量比较大、且一般无需更改。如果已经确定 prompt,可以预先计算文本的 embeddings tensor,并且存到本地;
- 2. webUI 的框架如果使用了两个以上的 controlNet condition,会涉及两个 condition 模型的交替 load 和 offload,如果显存足够,可以尝试长期置于 GPU(maybe 优化 1~2s);
- 3. 可以尝试生成低分辨率的图,在之后接 Upscaler(这个从原理上讲,其实速度上不会有太多提升,不过可以减少显存占用,而 webUI 里的 sdp attention 优化就是使用更多显存来加速的)# SD-2.x 系;
- 4. Latent Couple 优化方案;