Execute_QAT

Execute Record

Record

Steps:

Train the Model Using Training Session:

Data preparation

```
bash scripts/get_coco.sh
```

Download MS COCO dataset images (train, val, test) and labels. If you have previously used a different
version of YOLO, we strongly recommend that you delete train2017.cache and val2017.cache files,
and redownload labels

Single GPU training

```
# train yolov9 models
!python train_dual.py --workers 8 --device 0 --batch 16 --data data/coco.yaml --
img 640 --cfg models/detect/yolov9-c.yaml --weights yolov9-c.pt --name gelan-c --
hyp hyp.scratch-high.yaml --min-items 0 --epochs 100 --close-mosaic 15 --patience
10

# train gelan models
!python train.py --workers 8 --device 0 --batch 16 --data data/coco.yaml --img 640
--cfg models/detect/gelan-c.yaml --weights gelan-c.pt --name gelan-c --hyp
hyp.scratch-high.yaml --min-items 0 --epochs 100 --close-mosaic 15 --patience 10
```

Multiple GPU training

```
# train yolov9 models
!python -m torch.distributed.launch --nproc_per_node 8 --master_port 9527
train_dual.py --workers 8 --device 0,1,2,3,4,5,6,7 --sync-bn --batch 128 --data
data/coco.yaml --img 640 --cfg models/detect/yolov9-c.yaml --weights '' --name
yolov9-c --hyp hyp.scratch-high.yaml --min-items 0 --epochs 500 --close-mosaic 15

# train gelan models
!python -m torch.distributed.launch --nproc_per_node 4 --master_port 9527 train.py
--workers 8 --device 0,1,2,3 --sync-bn --batch 128 --data data/coco.yaml --img 640
--cfg models/detect/gelan-c.yaml --weights '' --name gelan-c --hyp hyp.scratch-
high.yaml --min-items 0 --epochs 500 --close-mosaic 15
```

Reparameterize the Model reparameterization.py:

ex: FP32 -> FP16

Proceed with Quantization

```
!python qat.py quantize --weights "C:\Users\PZJ\Desktop\yolov9\yolov9-main_measure\yolov9-main\yolov9-c7-converted.pt" --data data/coco.yaml --hyp ./data/hyps/hyp.scratch-high.yaml --name qat_yolov9_reparameterize --exist-ok
```

Eval Pytorch / Eval TensorRT (Will generate the val_trt file if succeed):

Evaluate using Pytorch

```
!python qat.py eval --weights "C:\Users\PZJ\Desktop\yolov9\yolov9-
main_measure\yolov9-main\yolov9-c7-converted.pt" --name
eval_qat_yolov9_reparameterize
```

Evaluate using TensorRT

Make sure to generate the .onnx through Export ONNX first !!

```
./scripts/val_trt.sh
runs/qat/qat_yolov9_reparameterize_SiLU/weights/qat_best_yolov9-c7-converted.pt
data/coco.yaml 640
```

Generate TensoRT Profiling and SVG image

```
./scripts/val_trt.sh
runs/qat/qat_yolov9_reparameterize_SiLU/weights/qat_best_yolov9-c7-converted.pt
data/coco.yaml 640 --generate-graph
```

Export ONNX

Export ONNX Model without End2End

```
!python export_qat.py --weights "C:\Users\PZJ\Desktop\yolov9\yolov9-
main_measure\yolov9-
main\runs\qat\qat_yolov9_reparameterize_SiLU\weights\qat_best_yolov9-c7-
converted.pt" --include onnx --dynamic --simplify --inplace
```

Export ONNX Model End2End

```
!python export_qat.py --weights "C:\Users\PZJ\Desktop\yolov9\yolov9-
main_measure\yolov9-
main\runs\qat\qat_yolov9_reparameterize_SiLU\weights\qat_best_yolov9-c7-
converted.pt" --include onnx_end2end
```

Deployment with Tensorrt

```
/usr/src/tensorrt/bin/trtexec \
    --onnx=runs/qat/qat_yolov9_reparameterize_SiLU/weights/qat_best_yolov9-c7-
converted.onnx \
    --int8 --fp16 \
    --useCudaGraph \
    --minShapes=images:1x3x640x640 \
    --optShapes=images:4x3x640x640 \
    --maxShapes=images:8x3x640x640 \
    --saveEngine=runs/qat/qat_yolov9_reparameterize_SiLU/weights/qat_best_yolov9-c7-
converted.engine
```

Benchmark

Note: To test FP16 Models (such as Origin) remove flag --int8

```
# Set variable batch_size and model_path_no_ext
# Mixed Precision
export batch size=4
export
filepath_no_ext=runs/qat/qat_yolov9_reparameterize_SiLU/weights/qat_best_yolov9-
c7-converted
trtexec \
    --onnx=${filepath_no_ext}.onnx \
    --fp16 \
    --int8 \
    --saveEngine=${filepath_no_ext}_bs4_MP_SiLU.engine \
    --timingCacheFile=${filepath_no_ext}.engine.timing.cache \
    --warmUp=500 \
    --duration=10 \
    --useCudaGraph \
    --useSpinWait \
    --noDataTransfers \
    --minShapes=images:1x3x640x640 \
    --optShapes=images:${batch_size}x3x640x640 \
    --maxShapes=images:${batch_size}x3x640x640
```

Use Timing Comparison

功能	val_trt.sh 指令	trtexec 指令
模型輸入	ONNX 模型 (qat_best_best.onnx)	ONNX 模型 (qat_best_yolov9- converted.onnx)
功能	驗證流程,可能包含推理、效能測試、精 度計算	轉換模型為 TensorRT 引擎,並進行效能測試
數據集設定	使用 data/coco.yaml	不涉及數據集驗證
動態輸入形 狀	可能默認封裝設定	明確指定 minShapes, optShapes, maxShapes
精度選項	未顯式提及 FP16/INT8 模式	明確指定fp16,int8
額外功能	生成計算圖 (generate-graph)	無此功能
執行細節	封裝於腳本中,細節未展開	直接執行 trtexec,所有參數顯式定義

Result --using Benchmark

yolov9-QAT(SiLU)

- SiLU_MP
- SiLU_INT8
- SiLU_FP16

yolov9-QAT(ReLU)

- ReLU_MP
- ReLU_INT8
- ReLU_FP16

yolov9-QAT(FReLU)

- FReLU_MP
- FReLU_INT8
- FReLU_FP16

yolov9-QAT(Mish)

Mish_MP

- Mish_INT8
- Mish_FP16

yolov9-QAT(Aconc)

- AconC_MP
- AconC_INT8
- AconC_FP16

Evaluation Results

Detection

Activation SiLU

Eval Model	AP	AP50	Precision	Recall
Origin (Pytorch)	0.3152	0.6856	0.6422	0.7023
INT8 (Pytorch)	0.3171	0.6828	0.6179	0.7044
INT8 (TensorRT)	0.3177	0.6838	0.613	0.7074

Activation ReLU

Eval Model	AP	AP50	Precision	Recall
Origin (Pytorch)	0.3152	0.6856	0.6422	0.7023
INT8 (Pytorch)	0.3171	0.6828	0.6179	0.7044
INT8 (TensorRT)	0.3179	0.6841	0.6149	0.709

Activation FReLU

Eval Model	AP	AP50	Precision	Recall
Origin (Pytorch)	0.3152	0.6856	0.6422	0.7023
INT8 (Pytorch)	0.3171	0.6828	0.6179	0.7044
INT8 (TensorRT)	0.318	0.6844	0.6142	0.709

Activation Mish

Eval Model	AP	AP50	Precision	Recall
Origin (Pytorch)	0.3152	0.6856	0.6422	0.7023
INT8 (Pytorch)	0.3171	0.6828	0.6179	0.7044

Eval Model	AP	AP50	Precision	Recall
INT8 (TensorRT)	0.318	0.6824	0.6161	0.7031

Activation AconC

Eval Model	AP	AP50	Precision	Recall
Origin (Pytorch)	0.3152	0.6856	0.6422	0.7023
INT8 (Pytorch)	0.3171	0.6828	0.6179	0.7044
INT8 (TensorRT)	0.318	0.6838	0.6213	0.7085

Evaluation Comparison

Activation SiLU

Eval Model	AP	AP50	Precision	Recall
INT8 (TensorRT) vs Origin (Pytorch)				
	+0.0025	-0.0018	-0.0292	+0.0051

Activation ReLU

Eval Model	AP	AP50	Precision	Recall
INT8 (TensorRT) vs Origin (Pytorch)				
	+0.0027	-0.0015	-0.0273	+0.0067

Activation FReLU

Eval Model	AP	AP50	Precision	Recall
INT8 (TensorRT) vs Origin (Pytorch)				
	+0.0028	-0.0012	-0.028	+0.0067

Activation Mish

Eval Model	AP	AP50	Precision	Recall
INT8 (TensorRT) vs Origin (Pytorch)				
	+0.0028	-0.0032	-0.0261	+0.0008

Activation AconC

Eval Model	AP	AP50	Precision	Recall

Eval Model	AP	AP50	Precision	Recall
INT8 (TensorRT) vs Origin (Pytorch)				
	+0.0028	-0.0018	-0.0209	+0.0062