

TFMQ-DM: Temporal Feature Maintenance Quantization for Diffusion Models

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Temporal Feature Disturbance



highest similarity with $\widehat{emb}_{t,i}$





Trajectory deviation. Denoising process of full precision (Upper) and w4a8 quantized (Lower) Stable-Diffusion, where the components Code is now unrelated to the generation of temporal available at: features are maintained in full precision.



Inducement Analyses

1. Inappropriate Reconstruction Target: Wrong objective and overfit.



when quantizing ResBlock and utilize naïve Activation ranges from sampling data-unrelated components.

2. Unaware of Finite Activations: Previous methods mainly focus on distribution and they ignore the range variations of finite activations across different t.

Temporal Feature Maintenance

1. Temporal Information Block: $\{g_i(h(\cdot))\}_{i=0,\dots,n}$;

strategy for that component.

2. Temporal Information Aware Reconstruction:

$$\mathcal{L}_{TIAR} = \sum_{i=0}^{n} \left\| g_i (h(t)) - \hat{g}_i \left(\hat{h}(t) \right) \right\|_F^2$$

3. Finite Set Calibration: $\hat{x} = \Phi\left(\left|\frac{x}{s_t}\right| + z_t, 0, 2^b - 1\right)$.



Experimental Results

1. Unconditional Image Generation

Methods	Bits (W/A)	LSUN-Bedrooms 256×256		LSUN-Churches 256×256		CelebA-HQ 256×256		FFHQ 256×256	
		FID↓	sFID↓	FID↓	sFID↓	FID↓	sFID↓	FID↓	sFID↓
Full Prec.	32/32	2.98	7.09	4.12	10.89	8.74	10.16	9.36	8.67
PTQ4DM*	4/32	4.83	7.94	4.92	13.94	13.67	14.72	11.74	12.18
Q-Diffusion [†]	4/32	4.20	7.66	4.55	11.90	11.09	12.00	11.60	10.30
PTQD*	4/32	4.42	7.88	4.67	13.68	11.06	12.21	12.01	11.12
TFMQ-DM (Ours)	4/32	3.60 (-0.60)	7.61 (-0.05)	4.07 (-0.48)	11.41 (-0.49)	8.74 (-2.32)	10.18 (-1.82)	9.89 (-1.71)	9.06 (-1.24)
PTQ4DM*	8/8	4.75	9.59	4.80	13.48	14.42	15.06	10.73	11.65
Q-Diffusion [†]	8/8	4.51	8.17	4.41	12.23	12.85	14.16	10.87	10.01
PTQD	8/8	3.75	9.89	4.89*	14.89*	12.76*	13.54*	10.69*	10.97*
TFMQ-DM (Ours)	8/8	3.14 (-0.61)	7.26 (-0.91)	4.01 (-0.40)	10.98 (-1.25)	8.71 (-4.05)	10.20 (-3.34)	9.46 (-1.23)	8.73 (-1.28)
PTQ4DM	4/8	20.72	54.30	4.97*	14.87*	17.08*	17.48*	11.83*	12.91*
Q-Diffusion ⁺	4/8	6.40	17.93	4.66	13.94	15.55	16.86	11.45	11.15
PTQD	4/8	5.94	15.16	5.10*	13.23*	15.47*	17.38*	11.42*	11.43*
TFMQ-DM (Ours)	4/8	3.68 (-2.26)	7.65 (-7.51)	4.14 (-0.52)	11.46 (-1.77)	8.76 (-6.71)	10.26 (-6.60)	9.97 (-1.45)	9.14 (-2.01)

2. Class-conditional & Text-guided Image Generation

10.68

10.40

Methods	Bits (W/A)	ImageNet 256×256			Methods	Rits (W/A)	MS-COCO			
		IS↑	FID↓	sFID↓	menous	bits (11/11)	FID↓	sFID↓	CLIP↑	
Full Prec.	32/32	235.64	10.91	7.67	Full Prec.	32/32	13.15	19.31	0.3146	
PTQ4DM	4/32	-	-	-	Q-Diffusion†	4/32	13.58	19.50	0.3143	
Q-Diffusion*	4/32	213.56	11.87	8.76	TFMO-DM (Ours)	4/32	13.21 (-0.37)	19.03 (-0.47)	0.3144 (+0.0001	
PTQD [†]	4/32	201.78	11.65	9.06						
TFMO-DM (Ours)	4/32	223.81 (+10.25)	10.50 (-1.15	7.98 (-0.78)	Q-Diffusion†	8/8	13.31	20.54	0.3134	
					TFMQ-DM (Ours)	8/8	13.09 (-0.22)) 19.91 (<mark>-0.63</mark>)	0.3134 (+0.0000	
PTQ4DM	8/8	161.75	12.59	-	0.0100.1.1	4.10				
Q-Diffusion*	8/8	187.65	12.80	9.87	Q-Diffusion [†]	4/8	14.49	20.43	0.3121	
PTQD	8/8	153.92	11.94	8.03	TFMQ-DM (Ours)	4/8	13.36 (-1.13)) 20.14 (-0.29)	0.3128 (+0.000)	
TFMQ-DM (Ours)	8/8	198.86 (+11.21)	10.79 (-1.15) 7.65 (-0.38)						
PTQ4DM	4/8	-	-	-						

14.85

12.63

3. Visualization Results

4/8

4/8 214.73

212.51

TFMQ-DM (Ours) 4/8 221.82 (+7.09) 10.29 (-0.11) 7.35 (-5.28)

O-Diffusio

PTOD

