



Enhanced Video Compression with Context-Aware Dynamic Neural Adapter

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Outline

- **Motivation**
- **Context-Aware Adapter**
- **Progressive Training**
- **Experiments**
- **Conclusion**

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Motivation

- Growing demands for video processing and analyzing



Smart Traffic



Automated Vehicle



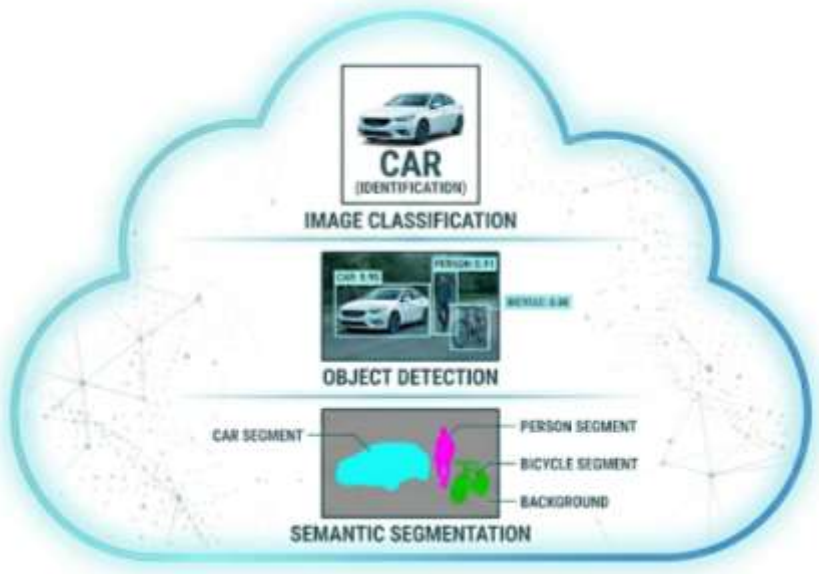
Indoor Surveillance

Motivation

■ Machine analytics under edge-cloud collaboration



Channel



Edge

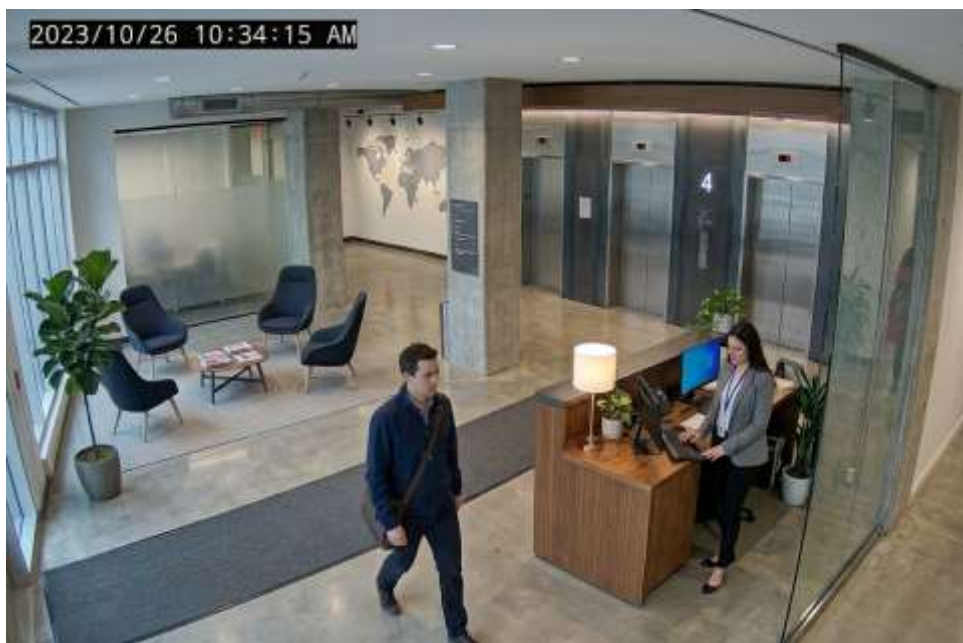
- Video data collection
- Simple computation
- Compression

Cloud

- Post-processing
- Complex analytics

Motivation

■ Simultaneous human and machine vision demands



Human Vision

For Inspection & Judgment

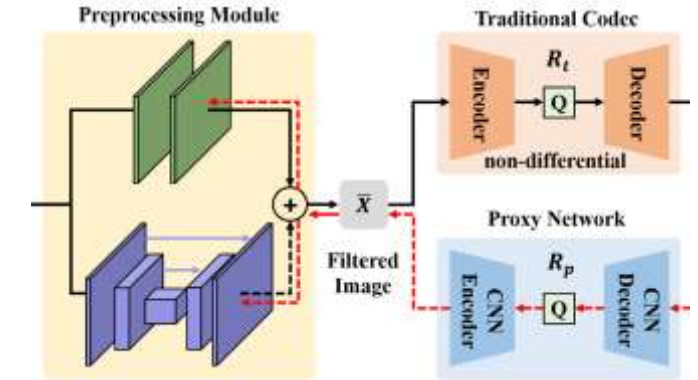
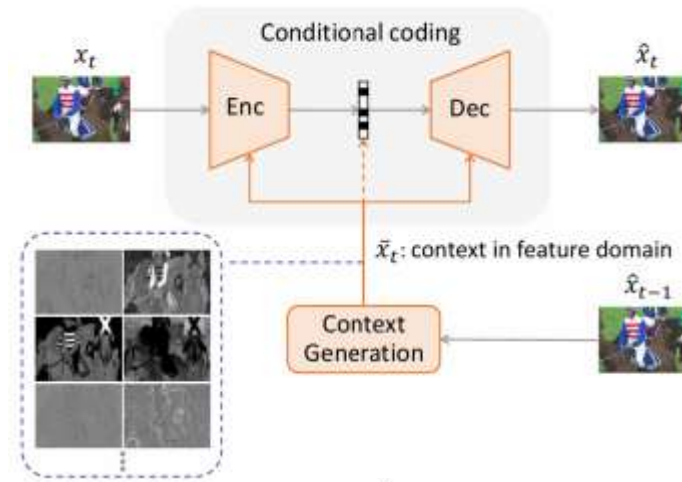


Machine Vision

For Automated Processing

Motivation

- Various video compression methods have arisen, but...



Modern coding standards

- For pixel-level reconstruction
- Limited adaptability

End-to-end compression

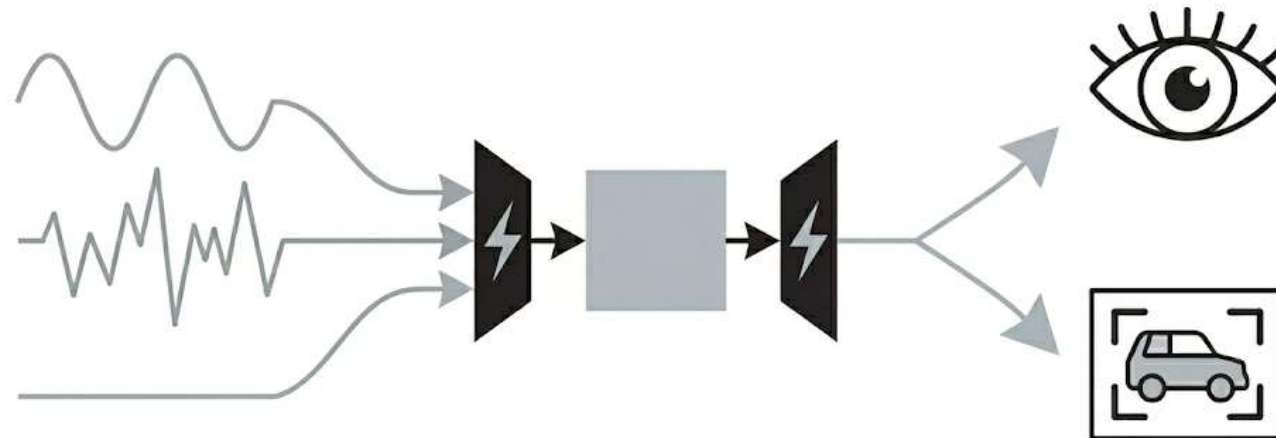
- High complexity
- Incompatibility

Deep neural network wrappers

- Limited to specific scenarios
- Poor task generalization

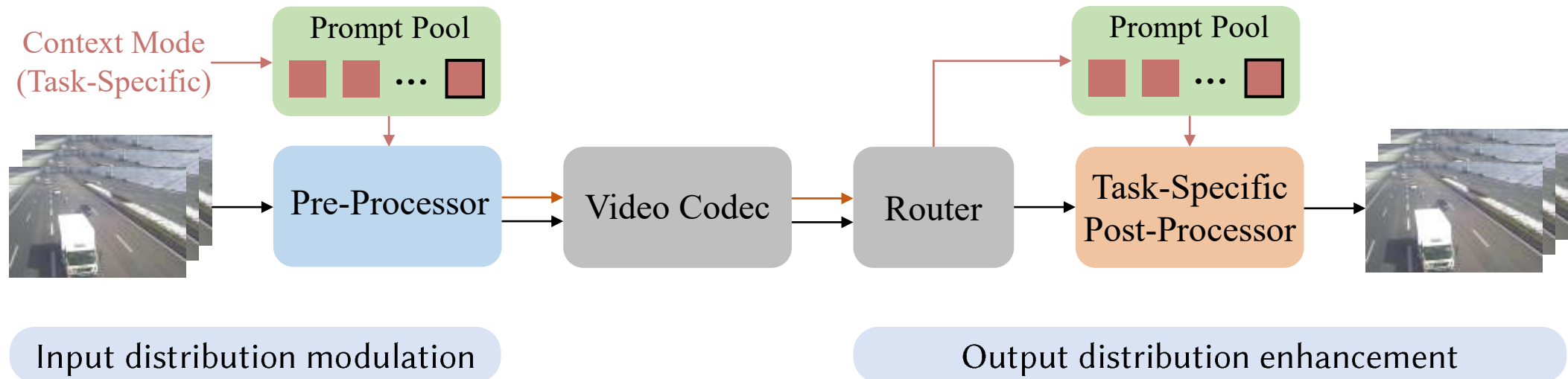
Motivation

- **A more flexible architecture is needed**
 - Adapt to various input distributions of signals
 - Handle different types of downstream tasks
 - Require low cost for edge device deployment
 - Be compatible with existing codecs



Motivation

- To decouple input/output distributions of signals from a core constant compression process, we propose **Context-Aware dynamic neural adapter for enhanced Video Compression (CAVC)**



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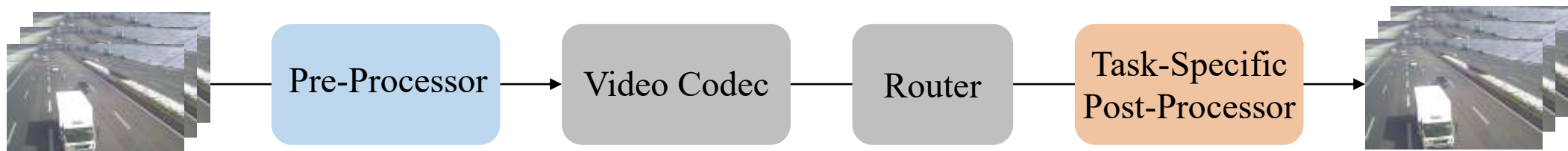
Context-Aware Adapter

- **A dynamic neural adapter**
 - Plug-and-play with existing video codecs
 - e.g., AVC, HEVC, VVC, ...
 - No modifications required to the core compression process



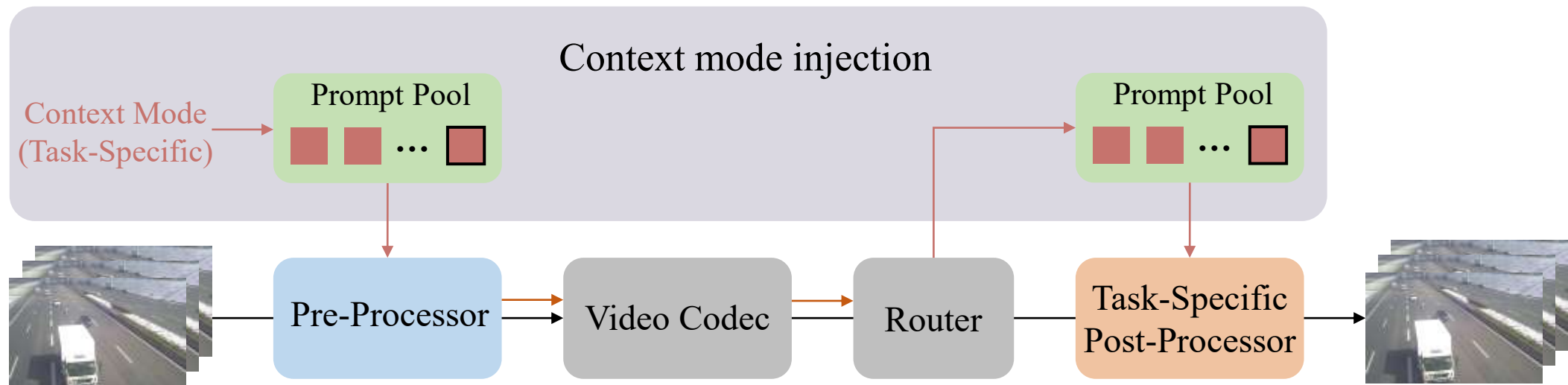
Context-Aware Adapter

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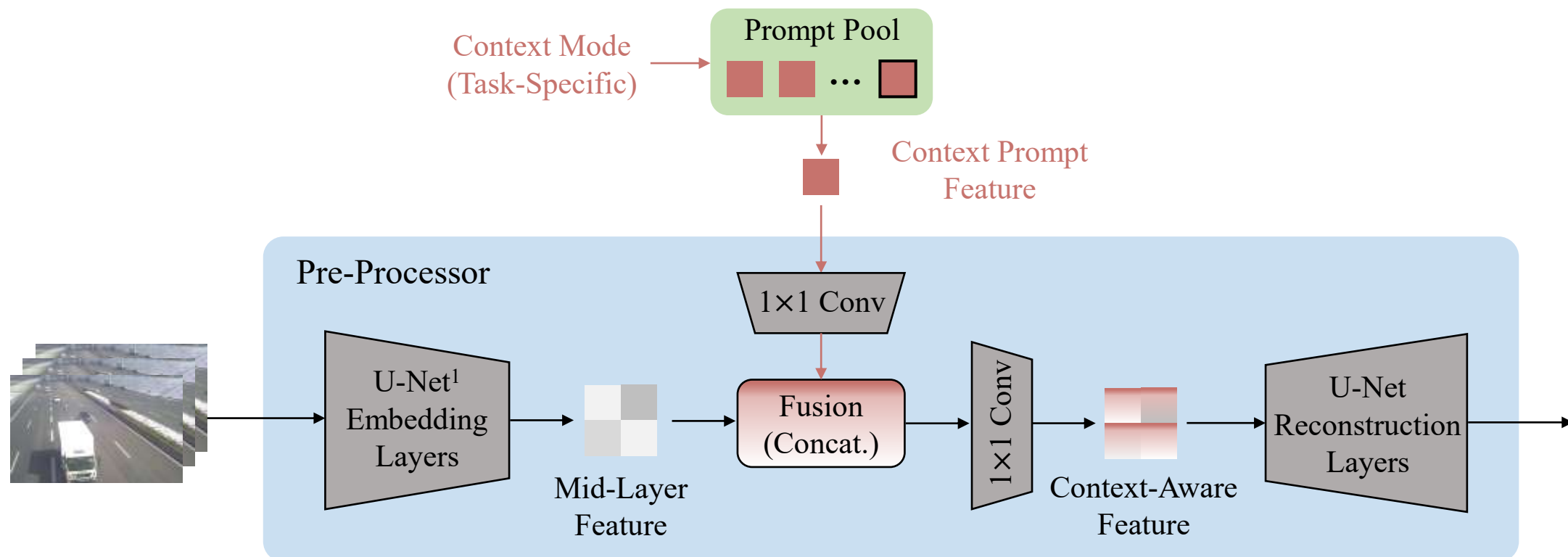
Context-Aware Adapter

- **How to control the Adapter?**
 - Context mode injection mechanism



Context-Aware Adapter

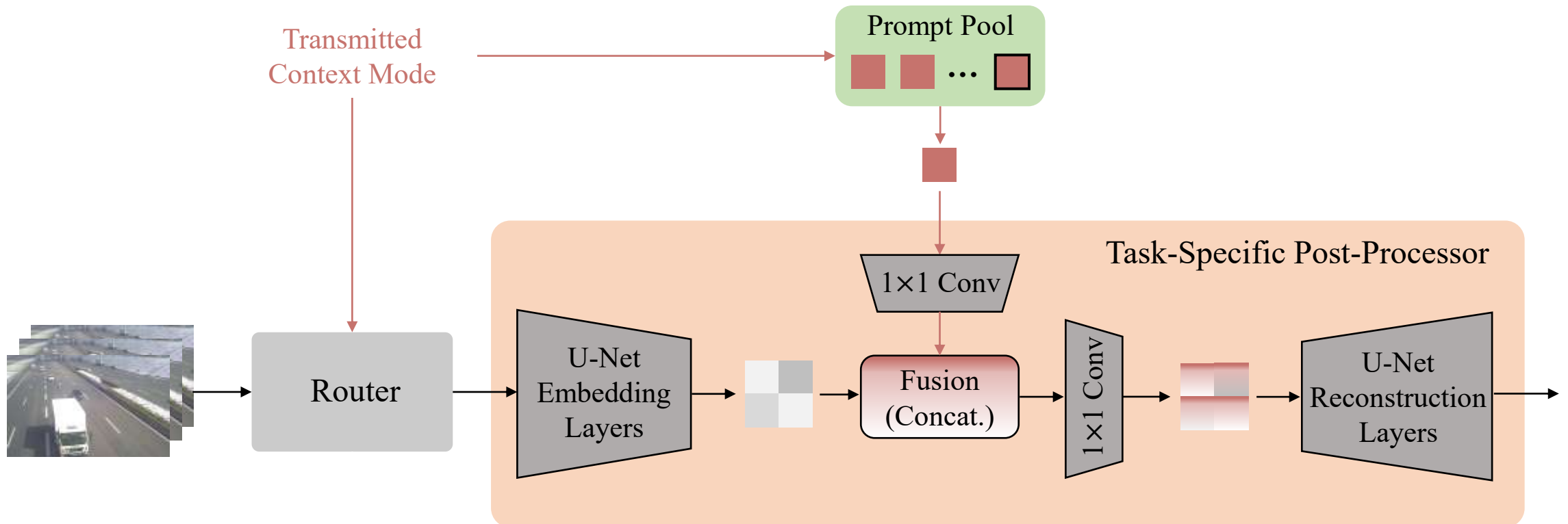
- **Context mode injection mechanism**
 - Mid-layer context feature fusion



¹U-Net: Convolutional networks for biomedical image segmentation, MICCAI 15

Context-Aware Adapter

- **Context mode injection mechanism**
 - Mid-layer context feature fusion

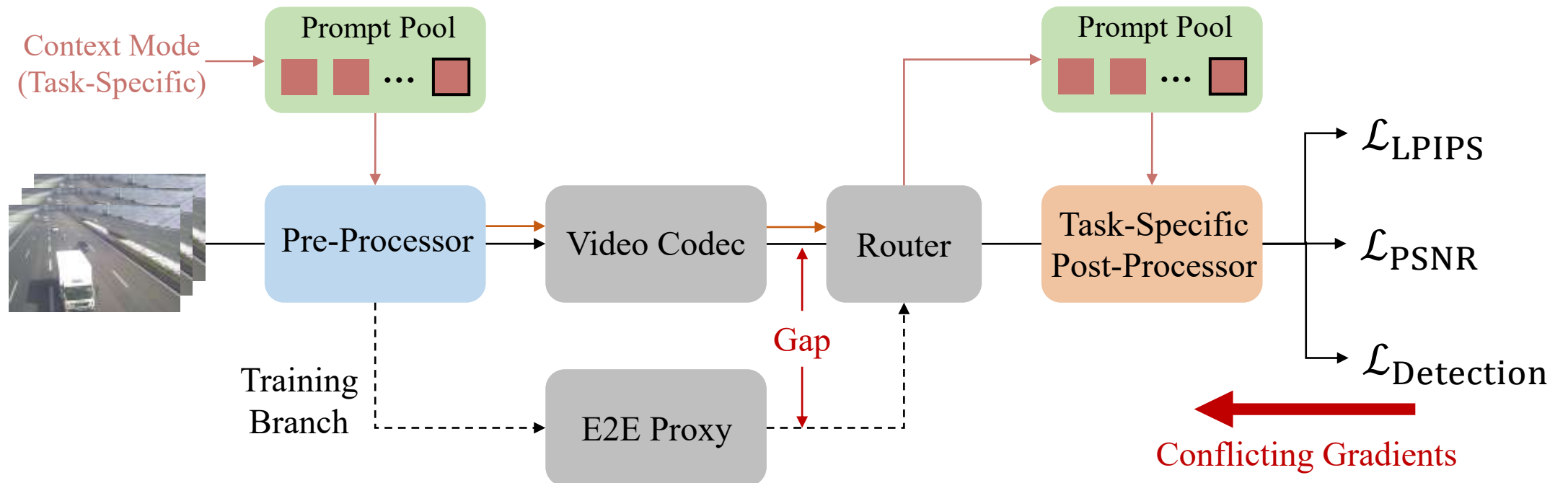


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- Context-Aware Adapter
- **Progressive Training**
- Experiments
- Conclusion

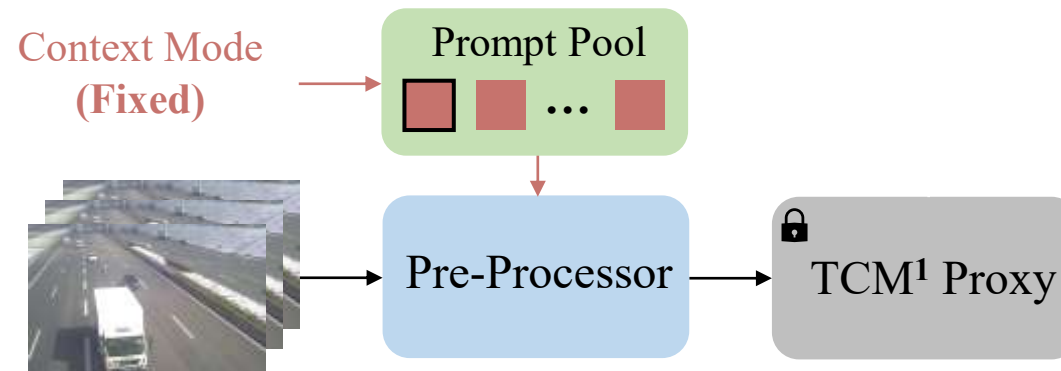
Progressive Training

- **Problems in practical training**
 - Joint multi-task training is unstable
 - Distribution gap between proxy and real codecs



Progressive Training

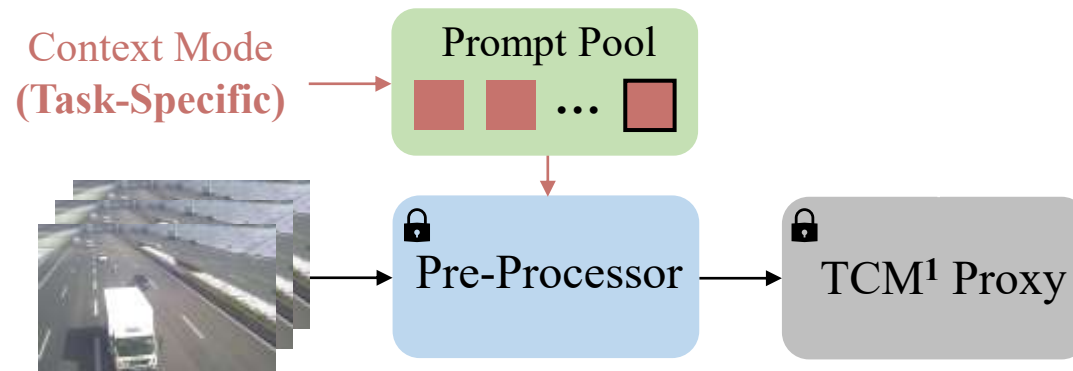
- **Joint multi-task training is unstable**
 - Initial Pre-Processor Training + Context Prompt Tuning



¹Learned Image compression with mixed transformer-CNN architectures, CVPR 23

Progressive Training

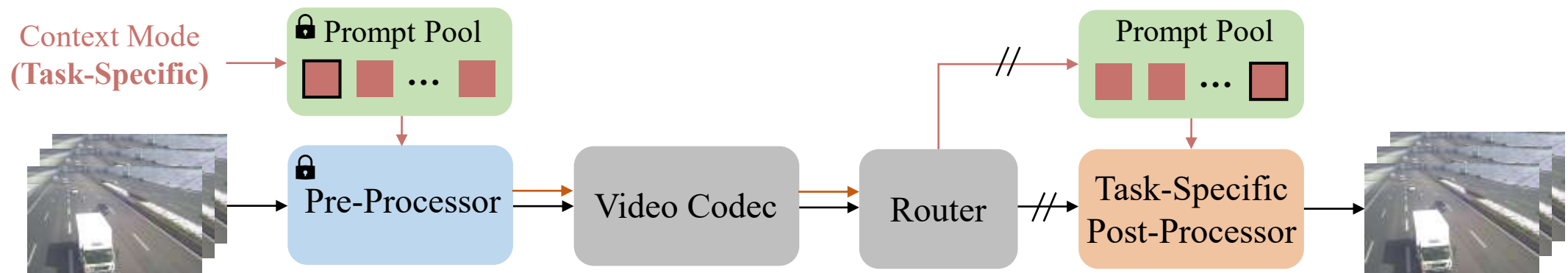
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Progressive Training

- **Distribution gap between proxy and real codecs**
 - Post-training with real codecs



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Experiments

■ Baselines

■ Standard video codecs

■ AVC

Overview of the H.264/AVC Video Coding Standard, TCSVT 03

■ HEVC

Overview of the High Efficiency Video Coding (HEVC) Standard, TCSVT 12

■ End-to-end (E2E) method

■ DCVC

Deep Contextual Video Compression, NeurIPS 21

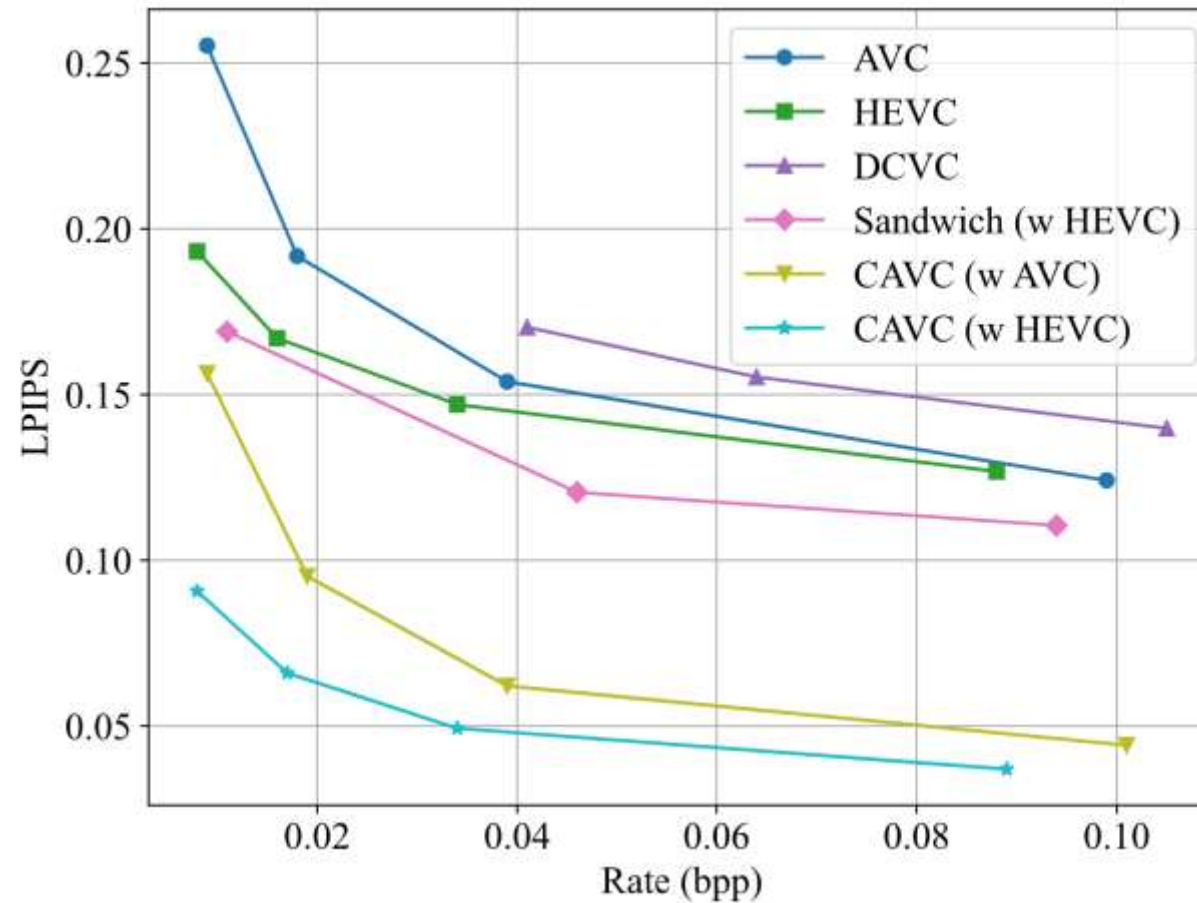
■ Deep neural network wrapper

■ Sandwich

Sandwiched Compression: Repurposing Standard Codecs with Neural Network Wrappers, arXiv 24

Experiments

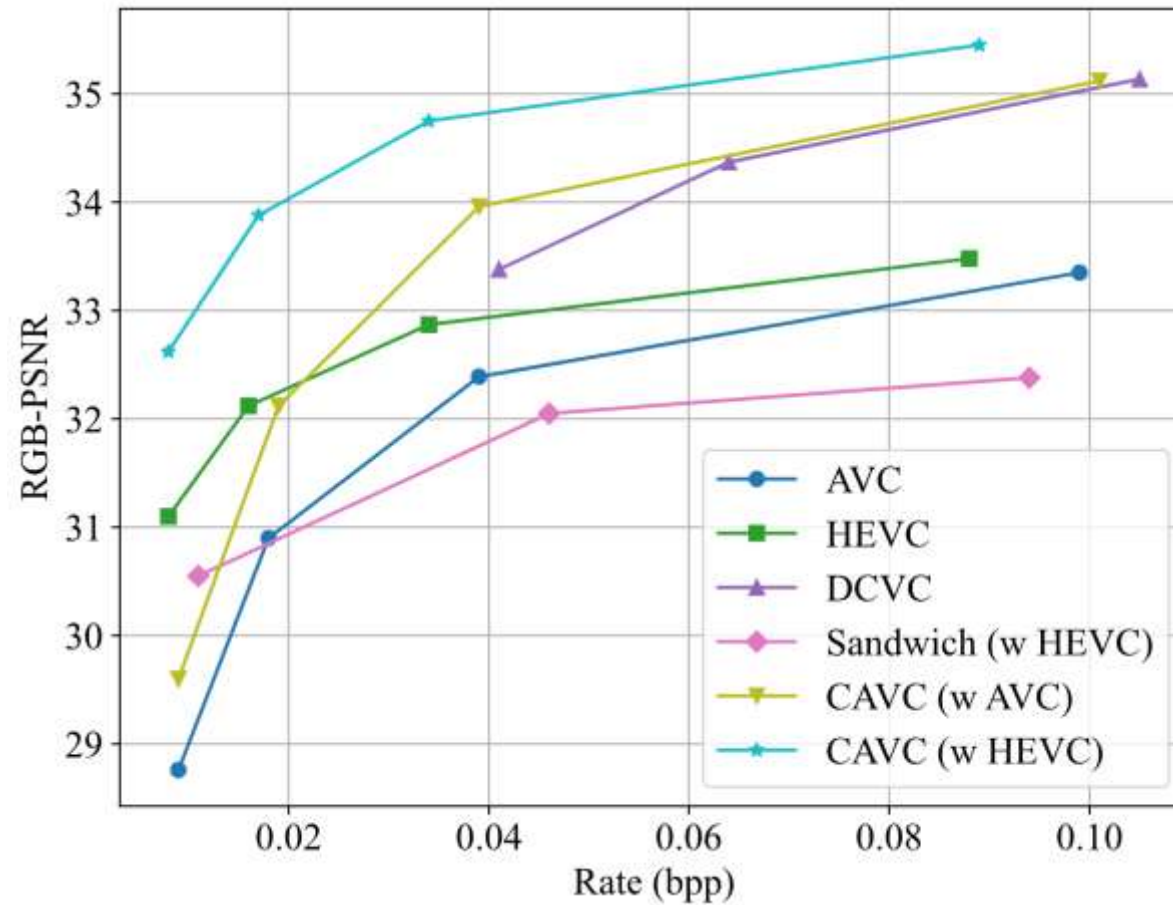
■ LPIPS-Alex on *UVG*¹



¹UVG dataset: 50/120fps 4k sequences for video codec analysis and development, ACM MMSys 20

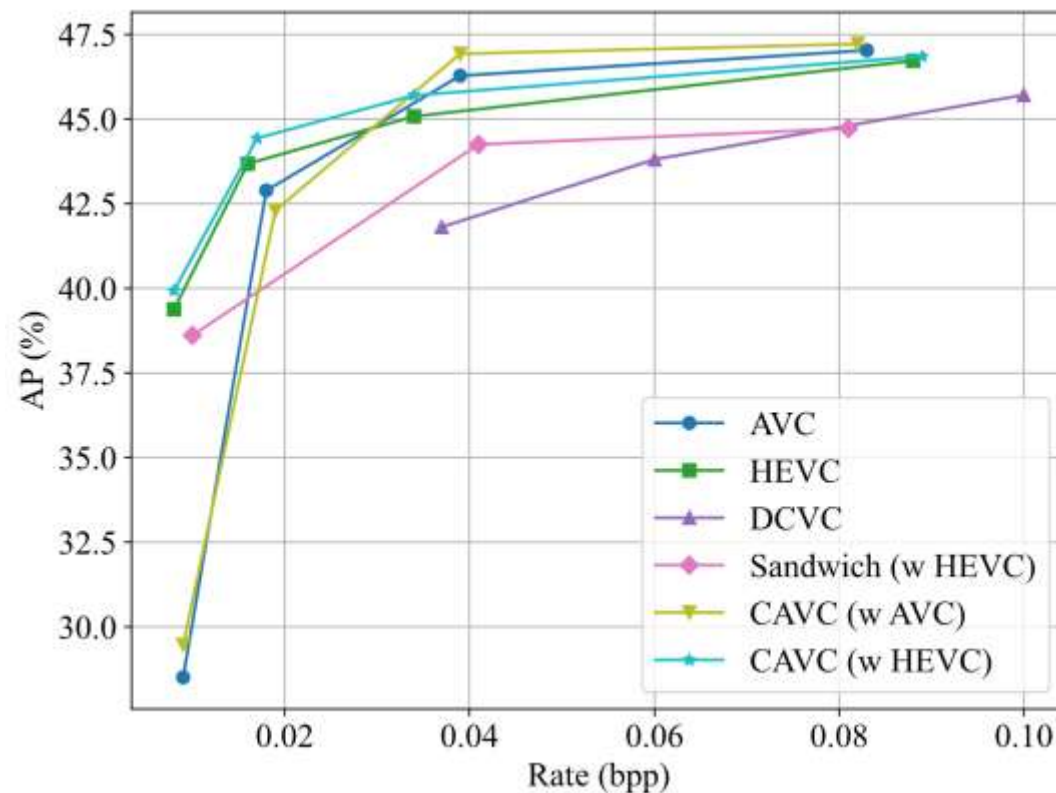
Experiments

■ PSNR on *UVG*



Experiments

■ Detection result (Average Precision) on *TUMTraj*¹



Highly Efficient for Edge Deployment!

↓ 49.9% FLOPs (vs. DCVC) | +1.3% Params overhead for pre-processor

¹A9-dataset: Multi-sensor infrastructure-based dataset for mobility research, IV 22

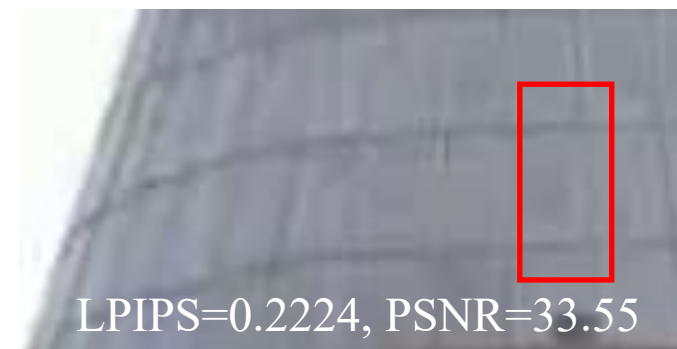
Experiments

■ Visual comparisons

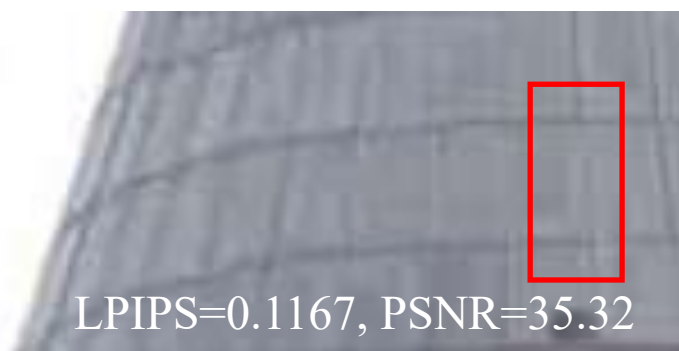
■ Human vision (LPIPS & PSNR)



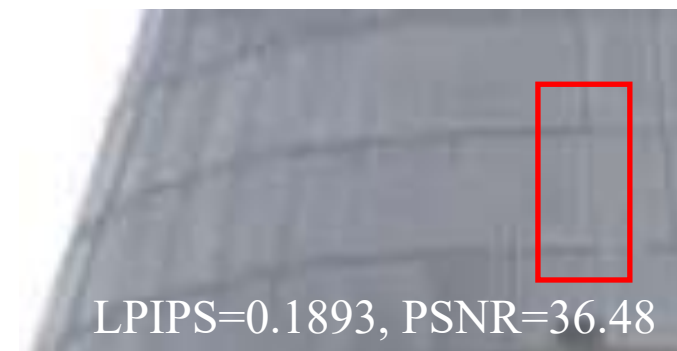
Ground Truth



HEVC bpp=0.038



CAVC (w HEVC, LPIPS) bpp=0.033



CAVC (w HEVC, PSNR) bpp=0.033

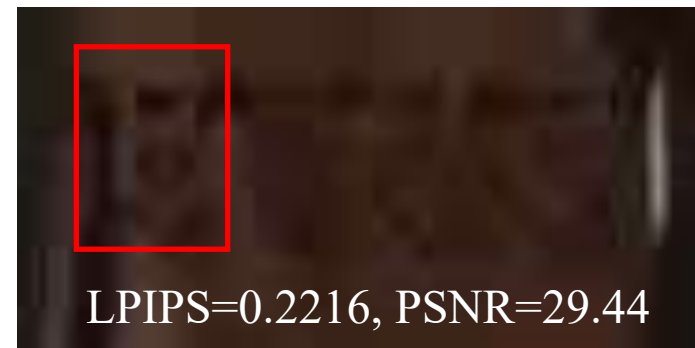
Experiments

■ Visual comparisons

■ Human vision (LPIPS & PSNR)



Ground Truth



LPIPS=0.2216, PSNR=29.44

HEVC bpp=0.038



LPIPS=0.1187, PSNR=30.22

CAVC (w HEVC, LPIPS) bpp=0.033



LPIPS=0.1973, PSNR=31.48

CAVC (w HEVC, PSNR) bpp=0.033

Experiments

■ Visual comparisons

■ Machine vision (object detection)



Ground Truth



HEVC $\text{bpp}=0.016$

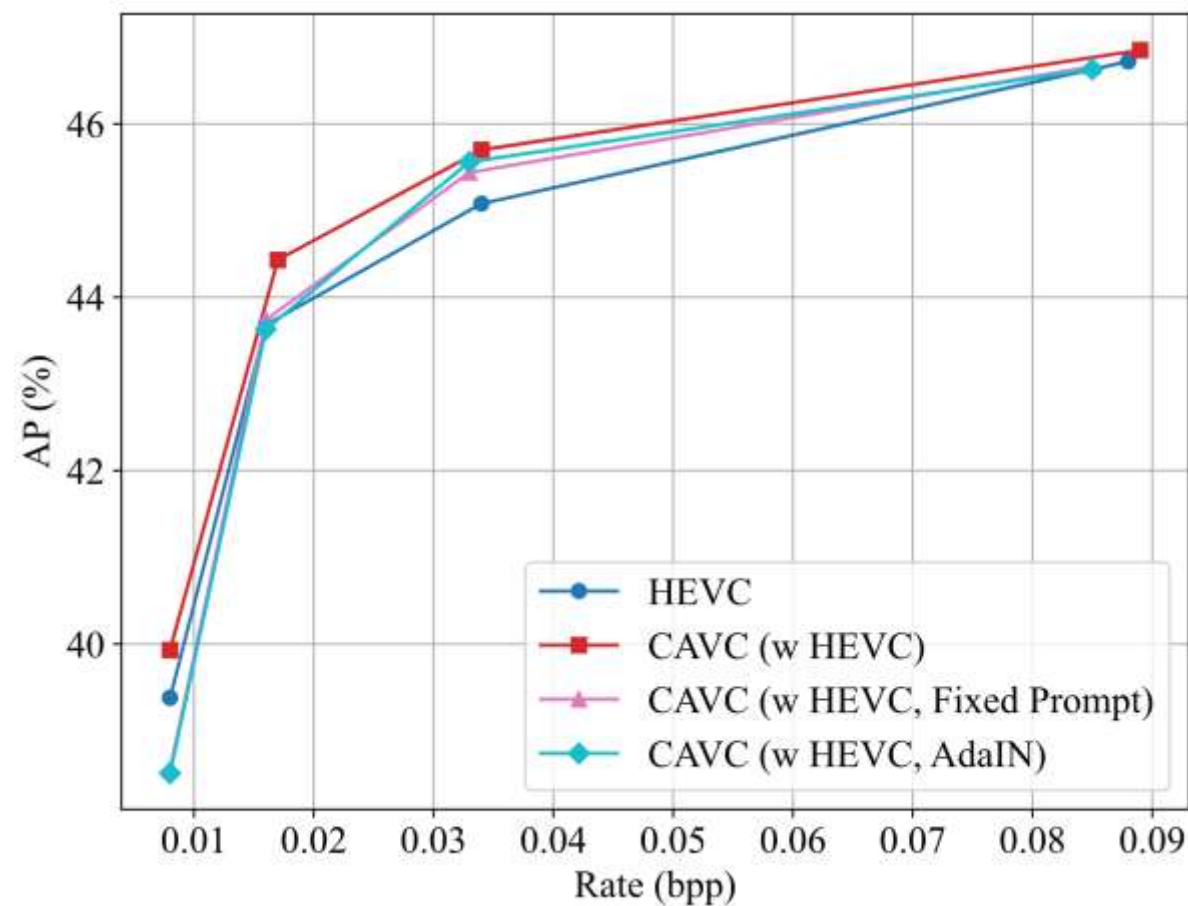


CAVC (w HEVC) $\text{bpp}=0.016$

Experiments

■ Ablation study

- Role of context prompts
- Context injection strategy



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Conclusion

■ A novel video compression framework with dynamic adapter

■ Flexible

Context Mode Injection mechanism for multi-task adaptation

■ Compatible

Plug-and-play with standard video codecs

■ Comprehensive

Superior performance for both human vision and machine tasks (e.g., BD-rate -76.4% on PSNR and -8.3% on detection for HEVC)

■ Efficient

Reduces FLOPs by 49.9% (vs. DCVC) with 1.3% parameter overhead per task



Thank You!

Project Page



Group Page



Questions? Feel free to contact: carefree_sun@stu.pku.edu.cn