

# DEEPSTREAM SDK 6.0.1 FOR NVIDIA DGPU AND JETSON

RN-09353-003 | March 09, 2022 Advance Information | Subject to Change



## **TABLE OF CONTENTS**

1.0	ABOUT THIS RELEASE	3			
1.1					
	1.1.1 DS 6.0.1				
	1.1.2 DS 6.0				
	1.1.3 Graph Composer 1.0.0				
1.2					
1.3	Documentation in this Release				
1.4	Differences with Deepstream 4.0	-			
1.5	DIFFERENCES WITH DEEPSTREAM 5.X				
2.0	LIMITATIONS	8			
3.0	NOTES	10			
3.1	Applications May Be Deployed in a Docker Container	10			
3.2	Sample Applications Malfunction if Docker Environment Cannot Support Display				
3.3	Installing DeepStream on Jetson				
3.4	Triton Inference Server In Deepstream				
3.5	Deprecation Plan in the Upcoming Releases				

## 1.0 ABOUT THIS RELEASE

These release notes are for the NVIDIA® DeepStream SDK for NVIDIA® Tesla®, NVIDIA® Ampere® NVIDIA® Jetson AGX Xavier™, NVIDIA® Jetson Xavier™ NX, NVIDIA® Jetson Nano<sup>™</sup>, and NVIDIA<sup>®</sup> Jetson<sup>™</sup> TX2 platforms.

### 1.1 WHAT'S NEW

The following new features are supported in this DeepStream SDK release:

#### 1.1.1 DS 6.0.1

- ▶ DS 6.0.1 is minor release supporting Jetpack 4.6.1 (R32.7.1 L4T release) for Jetson. For x86/dGPU compute stack is same as DS 6.0.
- Minor bug fixes in Gst-nvvideo4linux2 encoder/decoder, Gst-nvstreammux, and Gstnvstreamdemux plugins
- ▶ Gst-nvinferserver plugin on Jetson now supports Triton 21.11

#### 1.1.2 DS 6.0

- ▶ AV sync support (Alpha) for Video Conferencing use cases.
- ▶ Mellanox NIC support for receiving Compressed/Uncompressed streams.
- Support for 2D body pose estimation, facial landmark estimation, Emotion recognition, Gaze, Heart Rate, and Gesture. ( https://github.com/NVIDIA-AI-<u>IOT/deepstream tao apps</u> branch: release/tao3.0 ds6.0ga).
- ► Enhancements in new GST-nvstreammux plugin (Beta) to support video conferencing use cases.

New nvstreammux can be enabled by exporting USE NEW NVSTREAMMUX=yes. For more information, see the "Gst-nvstreammux" section in the NVIDIA DeepStream SDK Developer Guide 6.0 Release.

- ▶ Enhancements in Gst-audio/video template plugins.
- ▶ Low latency mode support for decoder on dGPU/x86.
- ▶ Performance optimizations.
- ▶ New DeepSORT tracker (Alpha).
- ► Improved NVDCF tracker.

Note:

The KLT tracker functionality is deprecated. We recommend using NVDCF tracker.

- ▶ NVIDIA TAO toolkit (previously called NVIDIA Transfer Learning Toolkit) Models from https://github.com/NVIDIA-AI-IOT/deepstream tao apps integrated into SDK.
- ▶ Python binding enhancements
  - Bindings source code and build instructions are posted at https://github.com/NVIDIA-AI-IOT/deepstream python apps.
  - Cast functions added for all data structs.
- ▶ New sample applications in Python:
  - deepstream-imagedata-multistream-redaction-multi-stream pipeline with face detection and redaction.
  - deepstream-rtsp-in-rtsp-out-multi-stream pipeline with RTSP input/output.
- ► Gst-nvinfer plugin:
  - NHWC format support
  - TAO converter update for ONNX path
- ► Gst-nvinferserver plugin:
  - Support for Triton 21.08
  - gRPC support
- ▶ New plugins:
  - gst-nvdspreprocess plugin demonstrates inference on preprocessed ROIs configured for the streams.
  - Gst-nvdsasr plugin for automatic speech recognition (based on NVIDIA Riva SDK).
  - gst-nvds text to speech plugin for text to speech conversion (based on NVIDIA Riva SDK).
  - Gst-nvdsudpsrc plugin for supporting Mellanox NIC. For more details Refer "Gst-nvdsudpsrc "section in the NVIDIA DeepStream SDK Developer Guide 6.0 Release.

▶ New sample applications:

Note:

- Refer to README to check prerequisites before running below applications.
- Automatic Speech Recognition example: Demonstrates Automatic Speech Recognition functionality.

Note:

This application can be run inside DeepStream Triton x86 based docker. However, with grpc support in ASR plugin you can run this outside the docker

AV sync example: Demonstrates synchronization of audio, video, and text output from nvdsasr in DeepStream pipeline.

Note:

This application can be run inside DeepStream Triton x86 based docker. However, with gRPC support in ASR plugin you can run this outside the docker

- Action recognition sample: Demonstrates Action recognition using TAO Toolkit 3D and 2D RGB based models.
- Preprocessing plugin sample: Sample application implementation to demonstrate per stream preprocessing on ROIs.
- TTS sample: Demonstrates text to speech conversion functionality along with automatic speech recognition.

DeepStream 5.X Applications can be migrated to DeepStream 6.0.1. Refer to the "Application Migration to DeepStream 6.0.1 from DeepStream 5.X" section in the NVIDIA DeepStream SDK Developer Guide 6.0.1 Release.

### 1.1.3 Graph Composer 1.0.0

- ► Graph Execution Engine
  - Graph runtime to execute graphs implemented based on Graph Specification
  - Supported on Ubuntu 18.04 x86\_64 and NVIDIA Tegra Jetson
- ► Graph composer tools
  - Composer
    - x86 only (Ubuntu 18.04)
    - User friendly editor view
    - Registry list in view
    - Graph edit with various options
    - Graph open/save
    - Property editor
    - Graph Launcher
    - Container Builder Launcher

- Registry options
- Extension Generator
- Subgraph support
- Support to execute Graph from Composer UI
- Extension caching to improve graph install speed
- Registry CLI
  - x86\_64 and Jetson (Ubuntu 18.04)
  - Local and NVIDIA Cloud repository
  - Variants for CUDA 10.2 and 11.4
  - Version management based on Semantic versioning
  - Command Line Interface tool
  - Graph install for graph deploy
- Container Builder CLI
  - x86 only (Ubuntu 18.04)
  - Command Line Interface tool
  - Create container image for graphs
  - Supports .deb/PyPi/.tgz packages

### 1.2 CONTENTS OF THIS RELEASE

This release includes the following:

- ▶ The DeepStream SDK. Refer to NVIDIA DeepStream SDK Developer Guide 6.0.1 Release for a detailed description of the contents of the DeepStream release package. The Developer Guide also contains other information to help you get started with DeepStream, including information about system software and hardware requirements and external software dependencies that you must install before you use the SDK.
  - For detailed information about GStreamer plugins, metadata usage, see the "DeepStream Plugin Guide" section in the NVIDIA DeepStream SDK Developer Guide 6.0.1 Release.
  - For detailed troubleshooting information and frequently asked questions, see the "DeepStream Troubleshooting and FAQ Guide" section in the NVIDIA DeepStream SDK Developer Guide 6.0.1 Release.
- ▶ Graph Composer 1.0.0 and DeepStream reference graphs for dGPU and Jetson.
- ▶ DeepStream SDK for dGPU and Jetson Software License Agreement (SLA).
- ▶ LICENSE.txt contains the license terms of third-party libraries used.

### 1.3 DOCUMENTATION IN THIS RELEASE

This release contains the following documentation.

- ▶ NVIDIA DeepStream SDK Developer Guide 6.0.1 Release
- ▶ NVIDIA DeepStream SDK API Reference
- ▶ NVIDIA DeepStream Python API Reference

### 1.4 DIFFERENCES WITH DEEPSTREAM 4.0

▶ Bounding box coordinates are now in float data type.

### 1.5 DIFFERENCES WITH DEEPSTREAM 5.X

OpenCV is deprecated by default. But you can enable OpenCV in plugins such as nvinfer (nvdsinfer) and dsexample (gst-dsexample) by setting WITH OPENCV=1 in the Makefile of these components. Please refer component README for more instructions.

## 2.0 LIMITATIONS

This section provides details about issues discovered during development and QA but not resolved in this release.

- ▶ With V4L2 codecs only MAX 1024 (decode + encode) instances are provided. The maximum number of instances can be increased by doing changes in open-source code.
- ▶ detected-min-w and detected-min-h must be set to values larger than 32 in the primary inference configuration file (config infer primary.txt) for gstdsexample on Jetson.
- ▶ The Kafka protocol adapter sometimes does not automatically reconnect when the Kafka Broker to which it is connected goes down and comes back up, thereby requiring application restart.
- ▶ If the nvds log file, ds.log, has been deleted, then to restart logging you must delete the file /run/rsyslogd.pid within the container before reenabling logging by running the setup nvds logger.sh script as described in the "nvds\_logger: Logging Framework" sub-section in the "Gst-nvmsgbroker" section in the NVIDIA DeepStream Developer Guide 6.0.1 Release.
- ▶ On Jetson, running a DeepStream application over SSH (via putty) with X11 forwarding does not work.
- ▶ DeepStream currently expects model network width to be a multiple of 4 and network height to be a multiple of 2.
- ► Triton Inference Server implementation in DeepStream currently supports a single GPU. The models need to be configured to use a single GPU.
- ▶ For some models sometime output in DeepStream is not exactly same as observed in TAO Toolkit. This is due to input scaling algorithm differences.
- Dynamic resolution change support is Alpha quality.
- ▶ On the fly Model update only supports same type of Model with same Network parameters.
- GStreamer sink elements sending upstream QOS events lead to memory leaks in the DeepStream pipeline. Applications should make sure to set the property "gos" to

- FALSE explicitly. For reference applications, this can be done by setting qos=0 in all sink groups of the configuration file.
- ▶ The sample objectDetector FasterRCNN works only with the default TensorRT plugins that comes as part of TensorRT installation. The samples do not work with opensource plugins library from https://github.com/NVIDIA/TensorRT.
- ▶ The YOLOV3, FasterRCNN, SSD, DSSD, RetinaNet and MaskRCNN models from TAO Toolkit will require a TensorRT open-source build. To build TensorRT open-source plugins, refer to <a href="https://github.com/NVIDIA/TensorRT">https://github.com/NVIDIA/TensorRT</a>.
- ▶ Perf regression of 2 to 4 % is seen for T4 platform when used with GPU driver 470.63.01. Work-around is to use previous 465+ driver version.
- ▶ DLA numbers on Jetson NX and Jetson AGX are lower compared to DeepStream-5.1 release. This is because, a few layers now run on DLA instead of GPU and those layers are little slow on DLA. This is done to free GPU for other work.
- ▶ When running deepstream-app on nano, TX1 and TX2 with default configuration, the following warning is seen: A lot of buffers are being dropped. To avoid this warning, use max perf tracker configuration.
  - To do so, in [tracker] section of the application config file, set ll-config-file= config tracker NvDCF max perf.yml
- ▶ Performance of YoloV3, FasterRCNN, SSD, DSSD is lower compared to DeepStream-5.1 release. This is because the new TAO 3.0 models are heavy compared to earlier model version.
- ▶ DeepStream cannot be installed on the current 16 GB Xavier NX production modules since Jetpack software takes the entire 16 GB emmc memory space. We recommend using Xavier NX developer kits with 32 GB SD card.
- ▶ Rivermax SDK is not part of DeepStream. So, the following warning is observed (gstplugin-scanner:33257):

```
GStreamer-WARNING **: 11:38:46.882: Failed to load plugin
'/usr/lib/x86 64-linux-gnu/gstreamer-
1.0/deepstream/libnvdsgst udp.so': librivermax.so.0: cannot open
shared object file: No such file or directory
```

You can ignore this warning safely.

- ▶ In DeepStream Triton docker GstVideoAggregator related warnings might be seen but can be ignored safely.
- ▶ Sample graphs containing NvDsMultiSrcInput component result in segmentation fault when an error occurs during graph/pipeline initialization.

## 3.0 NOTES

- Optical flow is supported only on dGPUs having Turing architecture and on NVIDIA® Jetson AGX Xavier™ and NVIDIA® Jetson Xavier™ NX.
- NVIDIA® Jetson Nano™ and NVIDIA® Jetson™ TX2 support only FP16 and FP32 network precisions with NVIDIA® TensorRT™.
- ▶ Jetson AGX Xavier supports INT8, FP16 and FP32 network precisions with TensorRT.
- ▶ NVIDIA® DeepStream SDK 6.0.1 supports TAO 3.0 models (https://developer.nvidia.com/tao-toolkit). For more details, see https://github.com/NVIDIA-AI-IOT/deepstream tao apps.

### 3.1 APPLICATIONS MAY BE DEPLOYED IN A DOCKER **CONTAINER**

Applications built with DeepStream can be deployed using a Docker container, available on NGC (https://ngc.nvidia.com/). Sign up for an NVIDIA GPU Cloud account and look for DeepStream containers to get started.

After you sign into your NGC account, navigate to Dashboard  $\rightarrow$  Setup  $\rightarrow$  Get API key to get your nvcr.io authentication details.

As an example, you can use the DeepStream 6.0.1 docker containers on NGC and run the deepstream-test4-app sample application as an Azure edge runtime module on your edge device.

The following procedure deploys deepstream-test4-app:

- Using a sample video stream (sample\_720p.h264)
- Sending messages with minimal schema
- Running with display disabled

▶ Using message topic mytopic (message topic may not be empty)

Set up and install Azure IoT Edge on your system with the instructions provided in the Azure module client README file in the deepstream-6.0.1 package:

```
<deepstream-
6.0.1 package>/sources/libs/azure protocol adaptor/module client/README
```

Note:

For the Jetson platform, omit installation of the Moby packages. Moby is currently incompatible with NVIDIA Container Runtime.

See the Azure documentation for information about prerequisites for creating an Azure edge device on the Azure portal:

https://docs.microsoft.com/en-us/azure/iot-edge/how-to-deploy-modulesportal#prerequisites

#### To deploy deepstream-test4-app as an Azure IoT edge runtime module

- 1. On the Azure portal, click the IoT edge device you have created and click Set Modules.
- 2. Enter these settings:

### **Container Registry Settings:**

```
Name: NGC
```

Address: nvcr.io

User name: \$oauthtoken

Password: use the password or API key from your NGC account

#### Deployment modules:

Add a new module with the name ds

#### **Image URI:**

For x86 dockers:

```
docker pull nvcr.io/nvidia/deepstream:6.0.1-devel
docker pull nvcr.io/nvidia/deepstream:6.0.1-samples
docker pull nvcr.io/nvidia/deepstream:6.0.1-iot
docker pull nvcr.io/nvidia/deepstream:6.0.1-base
docker pull nvcr.io/nvidia/deepstream:6.0.1-triton
```

For Jetson dockers:

```
docker pull nvcr.io/nvidia/deepstream-14t:6.0.1-samples
```

```
docker pull nvcr.io/nvidia/deepstream-14t:6.0.1-iot
docker pull nvcr.io/nvidia/deepstream-14t:6.0.1-samples
docker pull nvcr.io/nvidia/deepstream-14t:6.0.1-triton
```

### **Container Create options:**

For Jetson:

```
{
    "HostConfig": {
           "Runtime": "nvidia"
    },
    "WorkingDir": "
/opt/nvidia/deepstream/deepstream-
6.0/sources/apps/sample apps/deepstream-test4",
    "ENTRYPOINT": [
        "/opt/nvidia/deepstream/deepstream-6.0/bin/deepstream-test4-
app",
        "-i", "/opt/nvidia/deepstream/deepstream-6.0/
samples/streams/sample 720p.h264",
"/opt/nvidia/deepstream/deepstream-
6.0/lib/libnvds azure edge proto.so",
        "--no-display",
        "-s",
        "1",
        "--topic",
        "mytopic"
    ]
```

For X86:

```
{
    "HostConfig": {
        "Runtime": "nvidia"
    "WorkingDir": "/opt/nvidia/deepstream/deepstream-
6.0/sources/apps/sample_apps/deepstream-test4",
    "ENTRYPOINT": [
        "/opt/nvidia/deepstream/deepstream-6.0/bin/deepstream-test4-
app",
        "-i", "/opt/nvidia/deepstream/deepstream-
6.0/samples/streams/sample_720p.h264",
        "/opt/nvidia/deepstream/deepstream-
6.0/lib/libnvds azure edge proto.so",
        "--no-display",
        "-s",
        "1",
        "--topic",
        "mytopic"
    ] }
```

- 3. Specify route options for the module:
  - Option 1: Use a default route where every message from every module is sent upstream.

```
"routes": {
 "route": "FROM /messages/* INTO $upstream"
```

Option 2: Specific routes where messages sent upstream can be filtered based on topic name. For example, in the sample test programs, topic name mytopic is used for the module name ds:

```
"routes": {
           "route": "FROM /messages/modules/ds/outputs/mytopic INTO
$upstream"
```

### 3.2 SAMPLE APPLICATIONS MALFUNCTION IF DOCKER **ENVIRONMENT CANNOT SUPPORT DISPLAY**

If the Docker environment cannot support display, the sample applications deepstream-test1, deepstream-test2, deepstream-test3, and deepstreamtest4 do not work as expected.

#### Workaround:

To correct this problem, you must recompile the test applications after replacing nveglglessink with fakesink. With deepstream-test4, you also have the option to specify fakesink by adding the --no-display command line switch.

### 3.3 INSTALLING DEEPSTREAM ON JETSON

- 1. Download the NVIDIA SDK Manager to install JetPack 4.6.1
- 2. Select all the JetPack 4.6.1 components except DeepStreamSDK from the "Additional SDKs" section.

Refer to the "Quick Start Guide" section in NVIDIA DeepStream SDK Guide 6.0.1 Release for updating additional BSP library. Continue with the DeepStream installation instructions after the BSP update.

Note:

- **NVIDIA Container Runtime"** package shall be installed using JetPack 4.6.1 and is a pre-requisite for all DeepStream L4T docker containers.
- It is recommended to use SD card images for Jetson Nano instead of flashing through SDK Manager. The minimum recommended size for SD cards is 32 GB

### 3.4 TRITON INFERENCE SERVER IN DEEPSTREAM

Triton inference server on dGPU is supported only via docker deepstream-14t:6.0.1-triton for x86. On Jetson we support that with or without docker.

Refer to the NVIDIA DeepStream Development Guide 6.0.1 Release for more details about Triton inference server.

Triton inference server Supports following frameworks:

Framework	Tesla	Jetson	Notes / Limitations
TensorRT	Yes	Yes	Supports TensorRT plan or engine file (.plan)
TensorFlow	Yes	Yes	Supports TensorRT optimization
			Supported model formats: GraphDef or SavedModel
			Other TF formats such as checkpoint variables or estimators not directly supported
			Supports both Tensorflow 1.x and Tensorflow 2.x. Triton defaults to use Tensorflow 1.x. If users need to run Tensorlfow 2.x models, need to update plugin config with:
			<pre>infer_config{ backend {   trt_is { model_repo{       backend_configs {            backend:       "tensorflow"</pre>
ONNX	Yes	Yes	Supports TensorRT optimization
PyTorch	Yes	No	PyTorch model must be traced with an example input and saved as a TorchScript Module (.pt)

For more information refer to the following links:

► Triton inference server model repository: https://docs.nvidia.com/deeplearning/sdk/triton-inference-serverguide/docs/model repository.html

Also contains more information on the supported frameworks.

- ► TensorRT optimization in Triton inference server for ONNX and TensorFlow: https://docs.nvidia.com/deeplearning/sdk/triton-inference-serverguide/docs/optimization.html#framework-specific-optimization
- ► TensorFlow with TensorRT: https://docs.nvidia.com/deeplearning/frameworks/tf-trt-user-guide/index.html
- ▶ TensorFlow saved model: https://www.tensorflow.org/guide/saved model#the savedmodel format on disk

### 3.5 DEPRECATION PLAN IN THE UPCOMING RELEASES

- ► Gst-nveglglessink and Gst-nvoverlaysink plugins will be deprecated from next release.
- ► HW mode for Gst-nvdsosd will not be supported from next release.

#### Notice

THE INFORMATION IN THIS DOCUMENT AND ALL OTHER INFORMATION CONTAINED IN NVIDIA DOCUMENTATION REFERENCED IN THIS DOCUMENT IS PROVIDED "AS IS." NVIDIA MAKES NO WARRANTIES, EXPRESSED, IMPLIED, STATUTORY, OR OTHERWISE WITH RESPECT TO THE INFORMATION FOR THE PRODUCT, AND EXPRESSLY DISCLAIMS ALL IMPLIED WARRANTIES OF NONINFRINGEMENT, MERCHANTABILITY, AND FITNESS FOR A PARTICULAR PURPOSE. Notwithstanding any damages that customer might incur for any reason whatsoever, NVIDIA's aggregate and cumulative liability towards customer for the product described in this document shall be limited in accordance with the NVIDIA terms and conditions of sale for the product. THE NVIDIA PRODUCT DESCRIBED IN THIS DOCUMENT IS NOT FAULT TOLERANT AND IS NOT DESIGNED, MANUFACTURED OR INTENDED FOR USE IN CONNECTION WITH THE DESIGN, CONSTRUCTION, MAINTENANCE, AND/OR OPERATION OF ANY SYSTEM WHERE THE USE OR A FAILURE OF SUCH SYSTEM COULD RESULT IN A SITUATION THAT THREATENS THE SAFETY OF HUMAN LIFE OR SEVERE PHYSICAL HARM OR PROPERTY DAMAGE (INCLUDING, FOR EXAMPLE, USE IN CONNECTION WITH ANY NUCLEAR, AVIONICS, LIFE SUPPORT OR OTHER LIFE CRITICAL APPLICATION). NVIDIA EXPRESSLY DISCLAIMS ANY EXPRESS OR IMPLIED WARRANTY OF FITNESS FOR SUCH HIGH RISK USES. NVIDIA SHALL NOT BE LIABLE TO CUSTOMER OR ANY THIRD PARTY, IN WHOLE OR IN PART, FOR ANY CLAIMS OR DAMAGES ARISING FROM SUCH HIGH RISK USES.

NVIDIA makes no representation or warranty that the product described in this document will be suitable for any specified use without further testing or modification. Testing of all parameters of each product is not necessarily performed by NVIDIA. It is customer's sole responsibility to ensure the product is suitable and fit for the application planned by customer and to do the necessary testing for the application in order to avoid a default of the application or the product. Weaknesses in customer's product designs may affect the quality and reliability of the NVIDIA product and may result in additional or different conditions and/or requirements beyond those contained in this document. NVIDIA does not accept any liability related to any default, damage, costs or problem which may be based on or attributable to: (i) the use of the NVIDIA product in any manner that is contrary to this document, or (ii) customer product designs.

Other than the right for customer to use the information in this document with the product, no other license, either expressed or implied, is hereby granted by NVIDIA under this document. Reproduction of information in this document is permissible only if reproduction is approved by NVIDIA in writing, is reproduced without alteration, and is accompanied by all associated conditions, limitations, and notices.

#### **Trademarks**

NVIDIA, the NVIDIA logo, TensorRT, Jetson Nano, Jetson AGX Xavier, Jetson Xavier NX, NVIDIA Ampere, and NVIDIA Tesla are trademarks and/or registered trademarks of NVIDIA Corporation in the Unites States and other countries. Other company and product names may be trademarks of the respective companies with which they are associated.

Copyright © 2022 NVIDIA CORPORATION & AFFILIATES. All rights reserved.

