

nnstreamer

Neural Networks as Filters of Stream Pipelines

실시간 데이터 흐름에 신경망을 쉽고 효율적으로 붙이고 구성하기

Samsung Research | AI Center | 함명주

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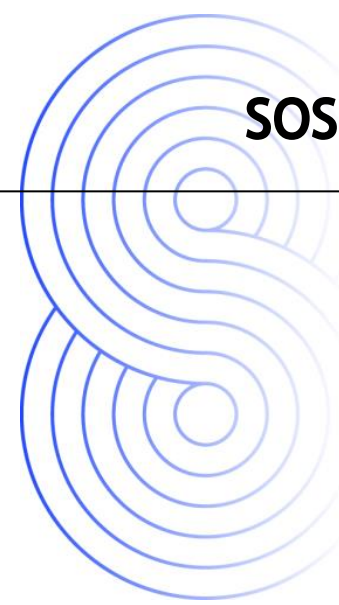
nnstreamer는?

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nnstreamer는 신경망들을 Stream Filter로 간주하여 사용할 수 있도록 해주는 **gststreamer** Plugin의 모음

gststreamer는 Multimedia Stream Pipeline을 다루기 위한 “전통” Framework

- Fully Open Sourced
 - <https://github.com/nnsuite/nnstreamer> 에서 코드 개발 진행
 - 누구나 제안/참여 가능
 - LGPLv2로서 누구나 사용 가능 (상업 사용 포함)



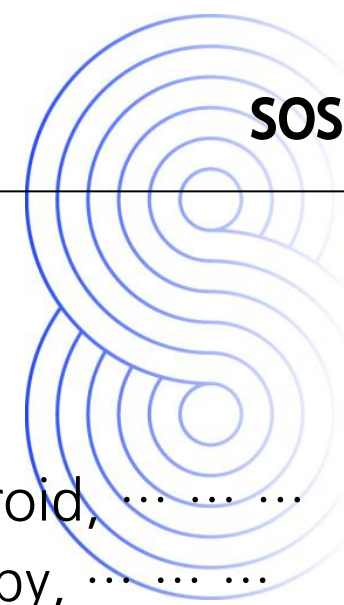
nnstreamer는?

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For Everyone!

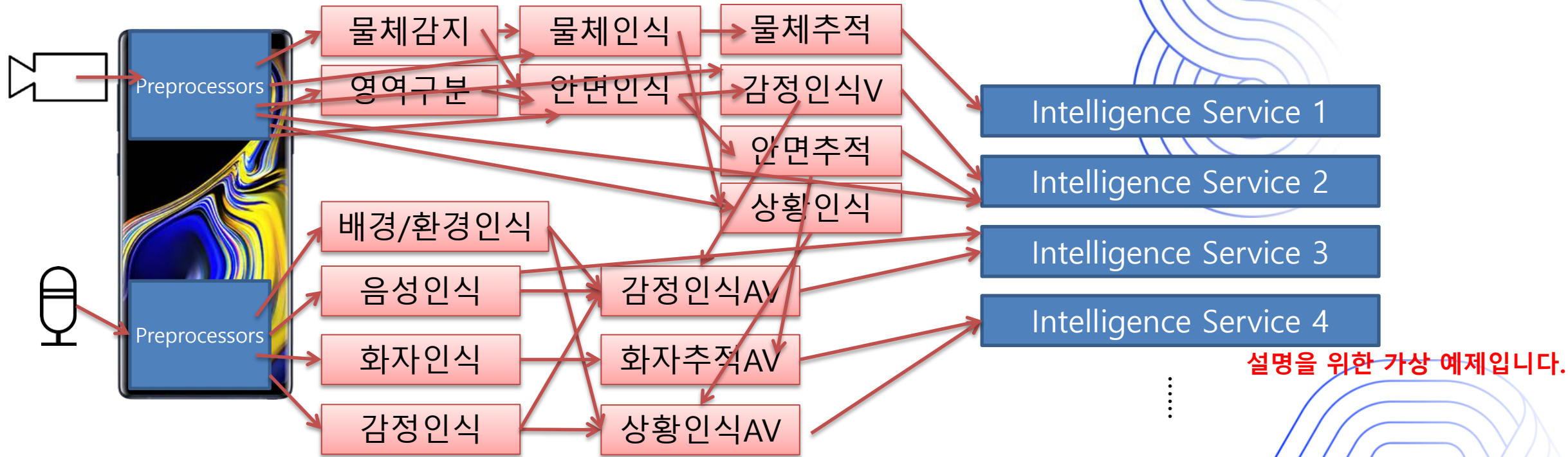
- OS: Linux (**Tizen/Ubuntu**/...), BSD, iOS, macOS, Windows, Android,
- Language: **C**, C++, C#(.NET), Java, Haskell, Qt, **Python**, Perl, Ruby,
- ISA: **x86_64**, x86_32, **armv7**, **aarch64**, ...
- PPA for Ubuntu-LTS: ppa:nnstreamer/ppa

Red-Bold: Official per-PR & daily build & test.



nnstreamer로 뭘 만들 수 있나요?

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- 다양한 신경망 Framework/Model 으로 구성된 Pipeline을 쉽게 구현
- 고성능 Data Stream 처리 기능 제공.
- 기존의 Multimedia Plugin과 Stream Framework의 재사용

Topics

Background	01
Motivation	02
Concepts	03
Details (nnstreamer Plugins)	04
Usage Example / Demo	05
How-To-Contribute	06
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Background

Cast Study

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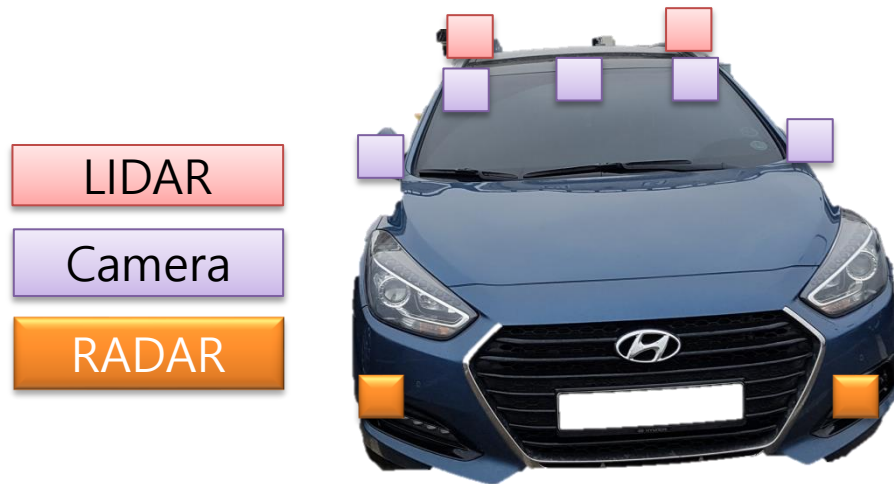
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Case 1: 자율주행

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* 실제 시스템보다 단순화 되었음.



Case 1: 자율주행 센서 / 신경망 모델

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실제보다 단순화 된 가상 모델

LIDAR

Camera

RADAR



Object Detection

Object Recognition

Object Tracking

Image Segmentation

Lane Detection

SLAM

Planning

Control

•
•
•
•
•
•
•



SLAM: Simultaneous localization and mapping

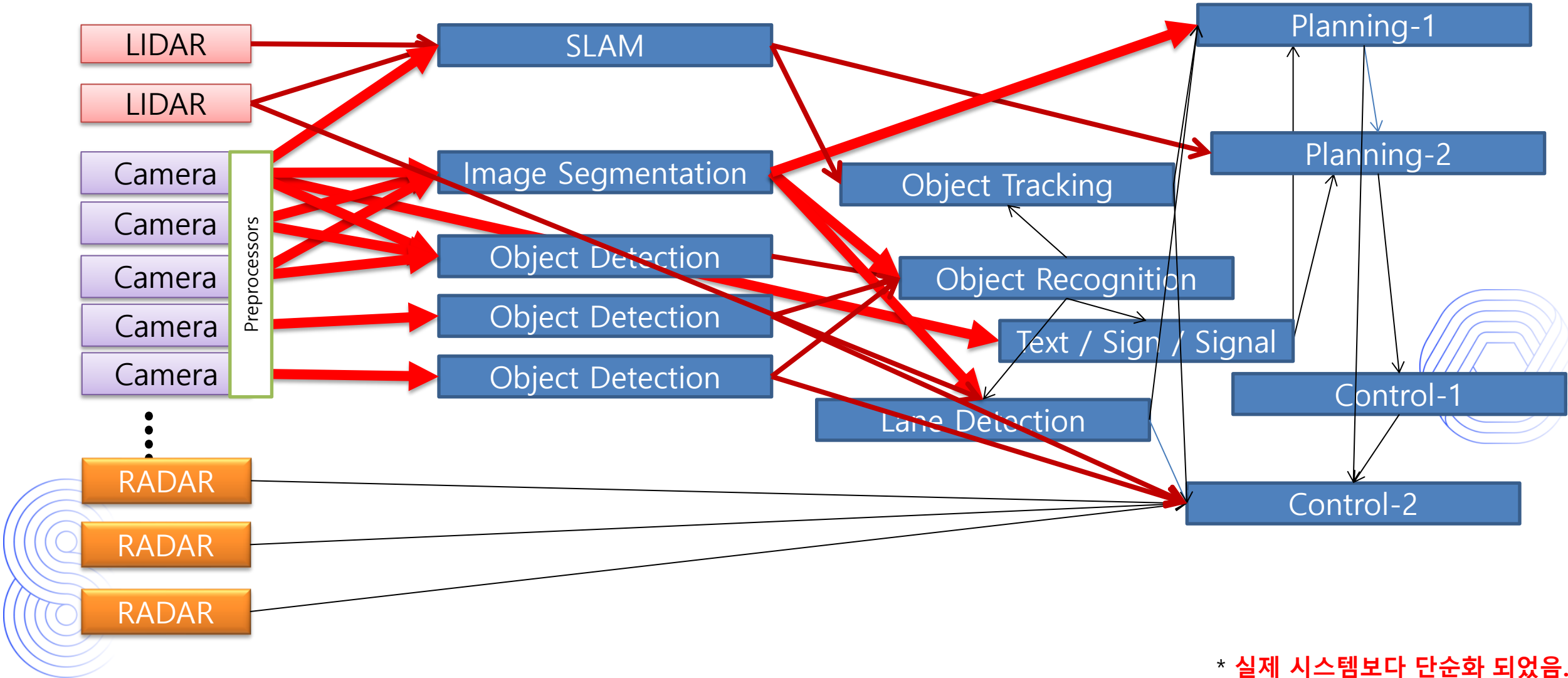
* 실제 시스템보다 단순화 되었음.



Case 1: 자율주행 Data Stream Pipelines

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실제보다 단순화 된 가상 모델



* 실제 시스템보다 단순화 되었음.

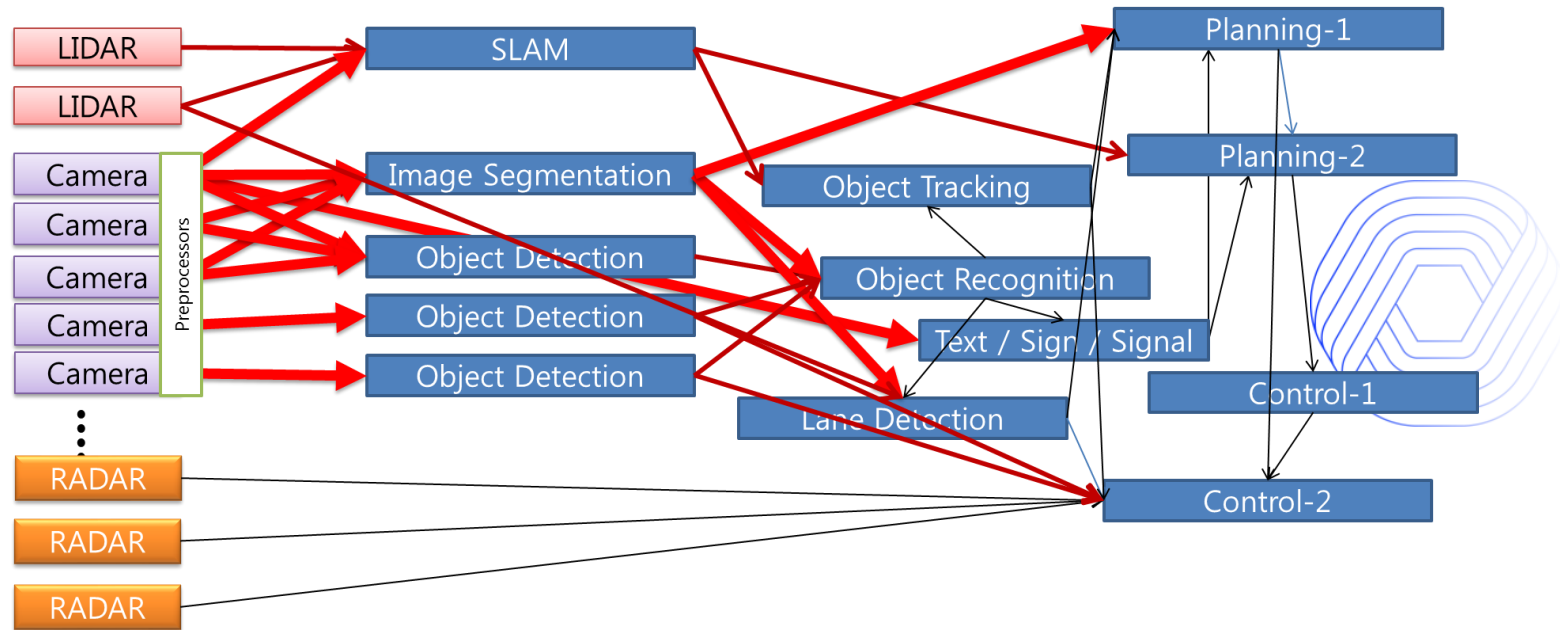


Case 1: 자율주행 Data Stream Pipelines

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주요 발생 이슈

- High Bandwidth
- Complex Pipeline Topology
- Synchronization & Parallelism
- Latency & Jitter Control





Case 1: 자율주행 Data Stream Pipelines w/ ROS

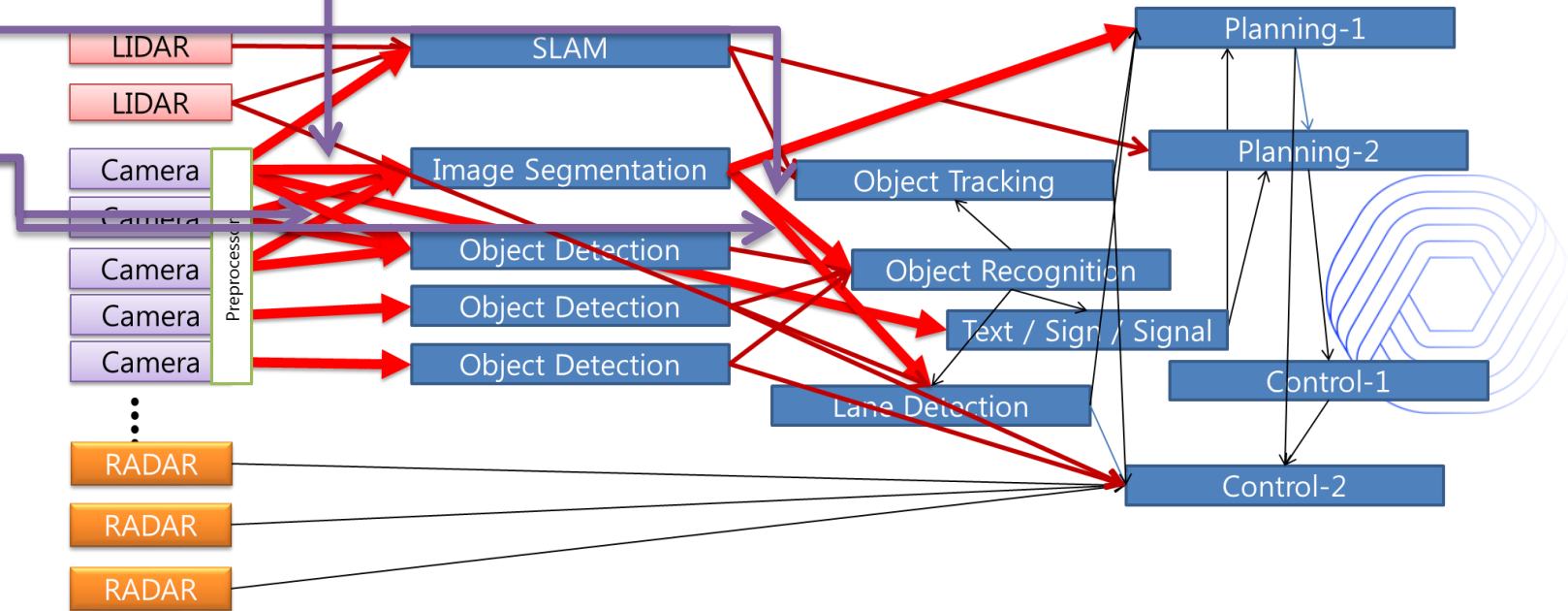
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ROS 사용 시 주요 발생 이슈 (Socket!)

- High Bandwidth

- 고해상도 이미지 실시간 전송
 - ROS2 / DDS (RTI Connex DDS) may help?
- 모델간 데이터 전송
- 중복 데이터 전송

- 고성능 Workstation에서도 감당하기 힘들 수 있음!!
(Memory Transaction!)



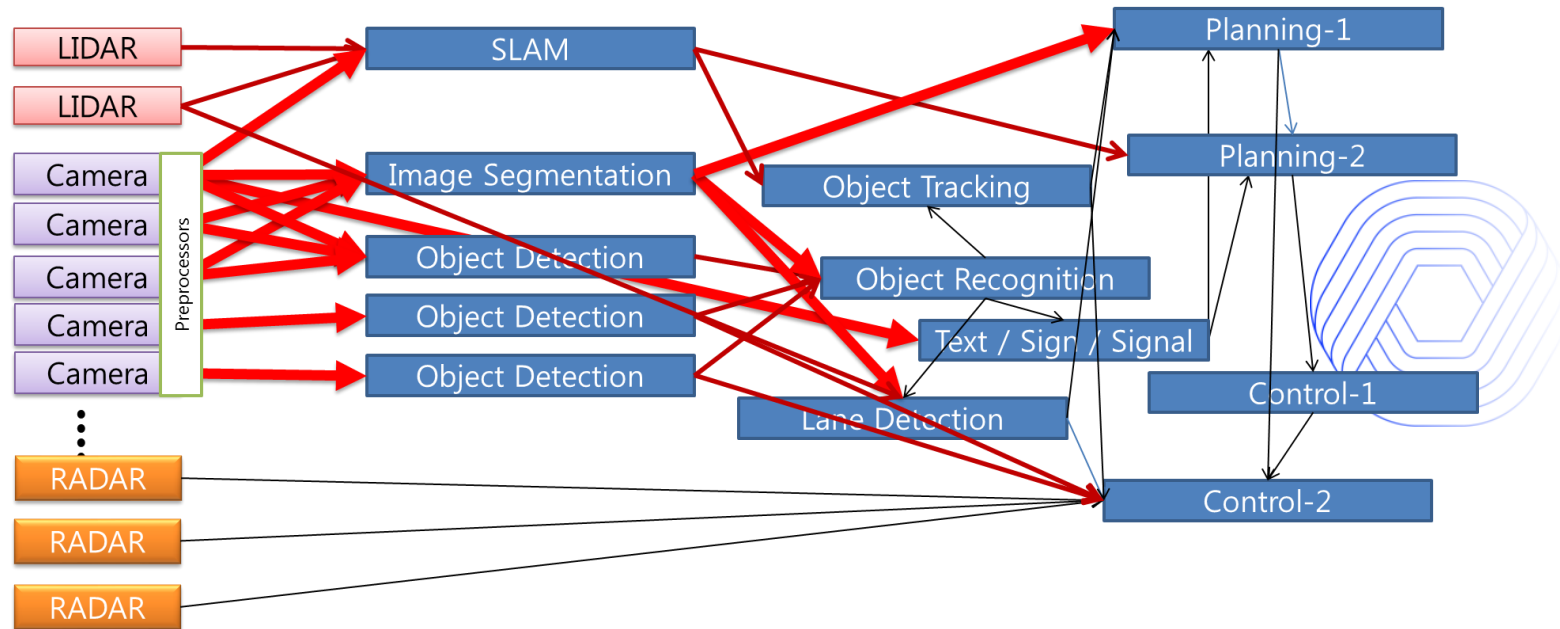


Case 1: 자율주행 Data Stream Pipelines

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ROS 사용 시 주요 발생 이슈 (Socket!)

- Complex Pipeline Topology
 - Pub/Sub 구조로 복잡한 Topology도 감당 가능.
 - Pub/Sub 구조는 Overkill???



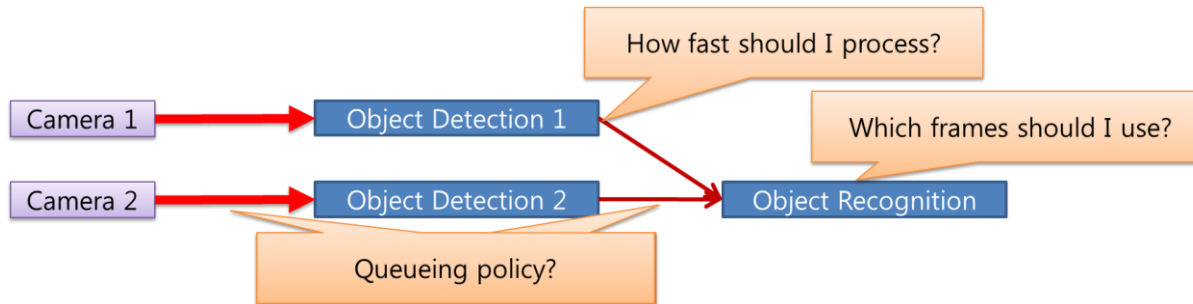


Case 1: 자율주행 Data Stream Pipelines

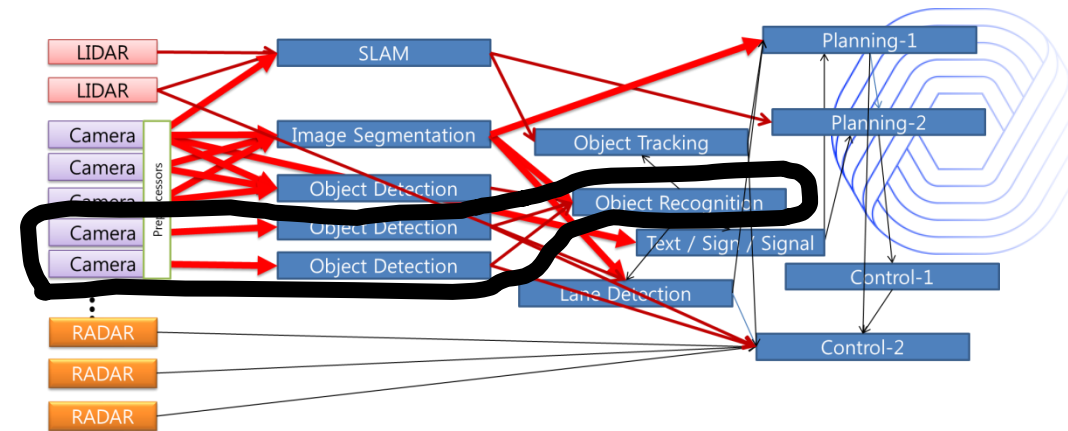
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ROS 사용 시 주요 발생 이슈 (Socket!)

- Synchronization
 - 독립 Process로 동작하여 **골치 아플 수 있음!**



- Parallelism
 - 각 Node는 독립 Process. 문제없음



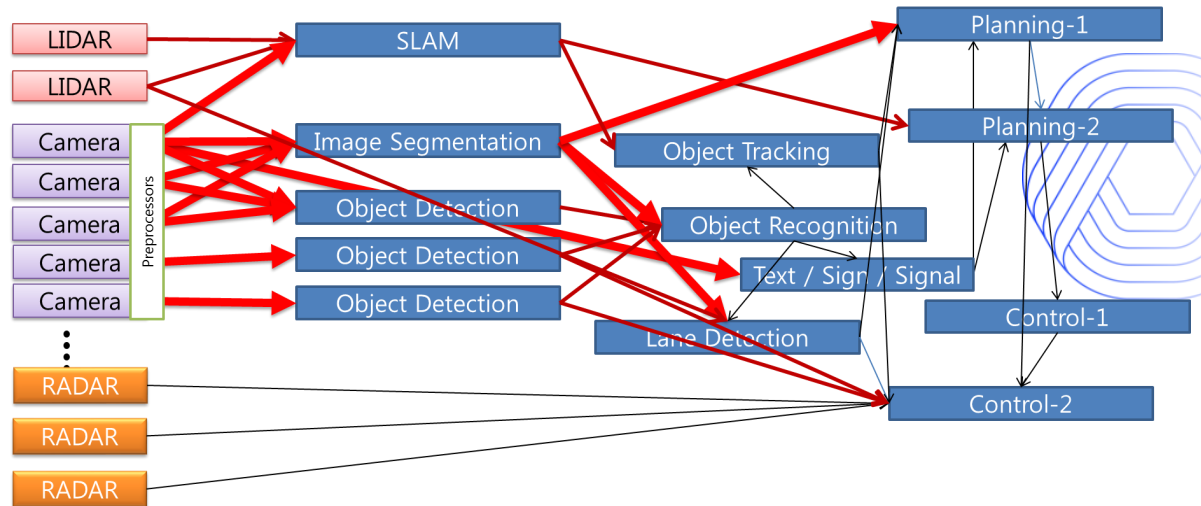


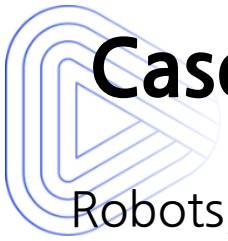
Case 1: 자율주행 Data Stream Pipelines w/ ROS

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ROS 사용 시 주요 발생 이슈 (Socket!)

- Latency
 - 과도한 Memcpy로 인해 Communication Latency 증가
- Jitter Control
 - 각 Node들에 대한 Resource/Rate 제어 어려움
 - Node간 생성물에 대해 동기화 어려움



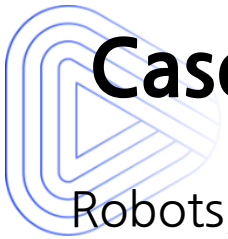


Case 2: Multi-Modal Interactions

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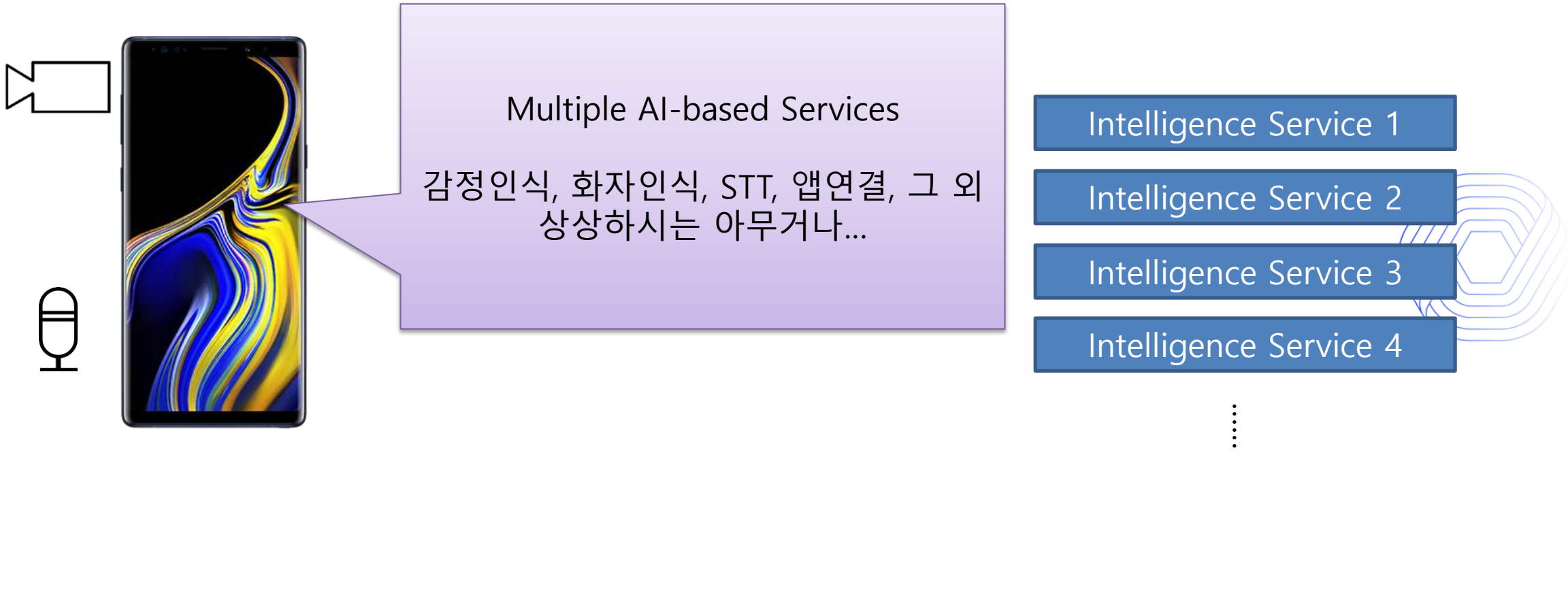


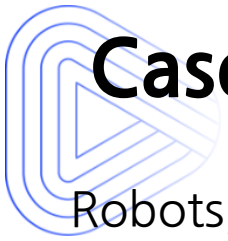


Case 2: Multi-Modal Interactions

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Case 2: Multi-Modal Interactions

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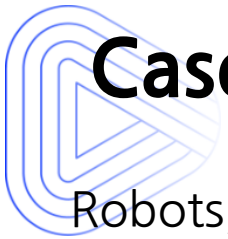
마이크 입력을 사용할 기본 요소?



⋮

설명을 위한 가상 예제입니다.





Case 2: Multi-Modal Interactions

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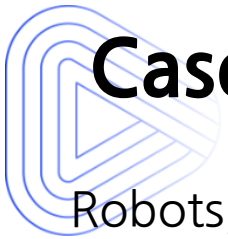
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비디오 입력을 사용할 기본 요소?



⋮

설명을 위한 가상 예제입니다.



Case 2: Multi-Modal Interactions

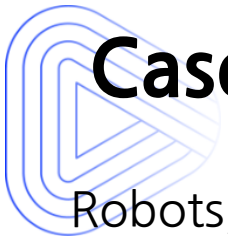
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오디오 비디오 입력을 함께 사용할 기본 요소?



설명을 위한 가상 예제입니다.



Case 2: Multi-Modal Interactions

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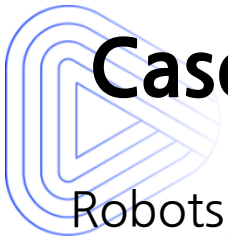
오디오 비디오 미디어 전처리



- Intelligence Service 1
- Intelligence Service 2
- Intelligence Service 3
- Intelligence Service 4

⋮

설명을 위한 가상 예제입니다.

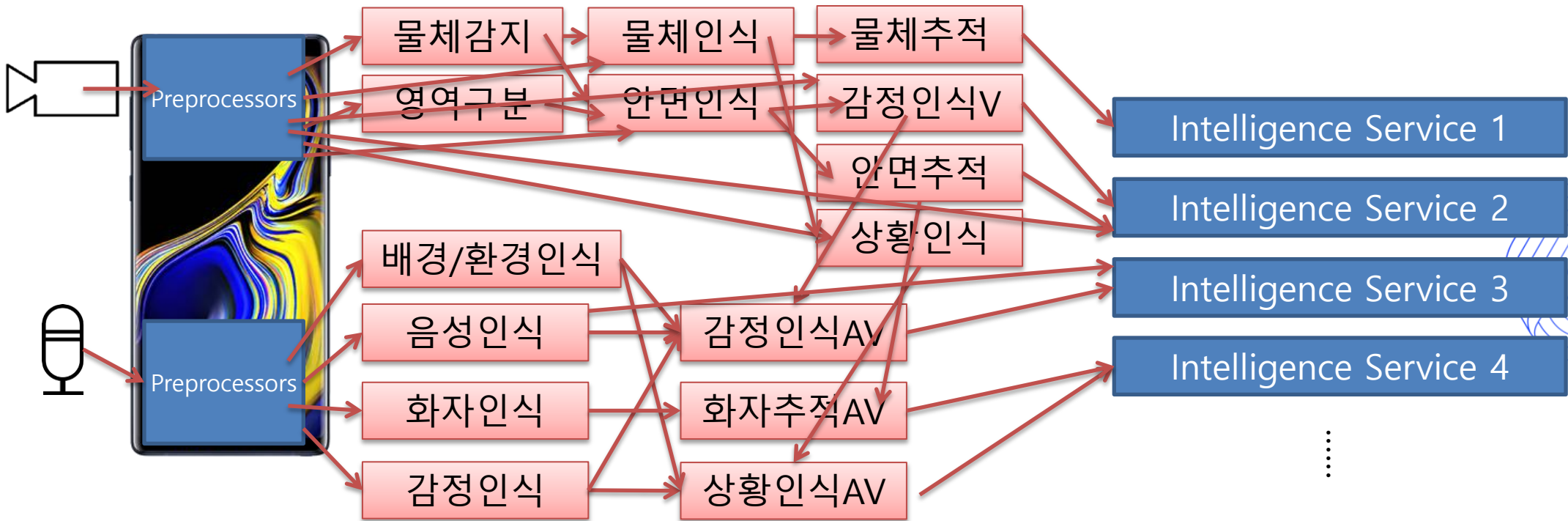


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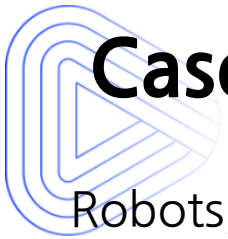
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Data Stream Pipelines



설명을 위한 가상 예제입니다.



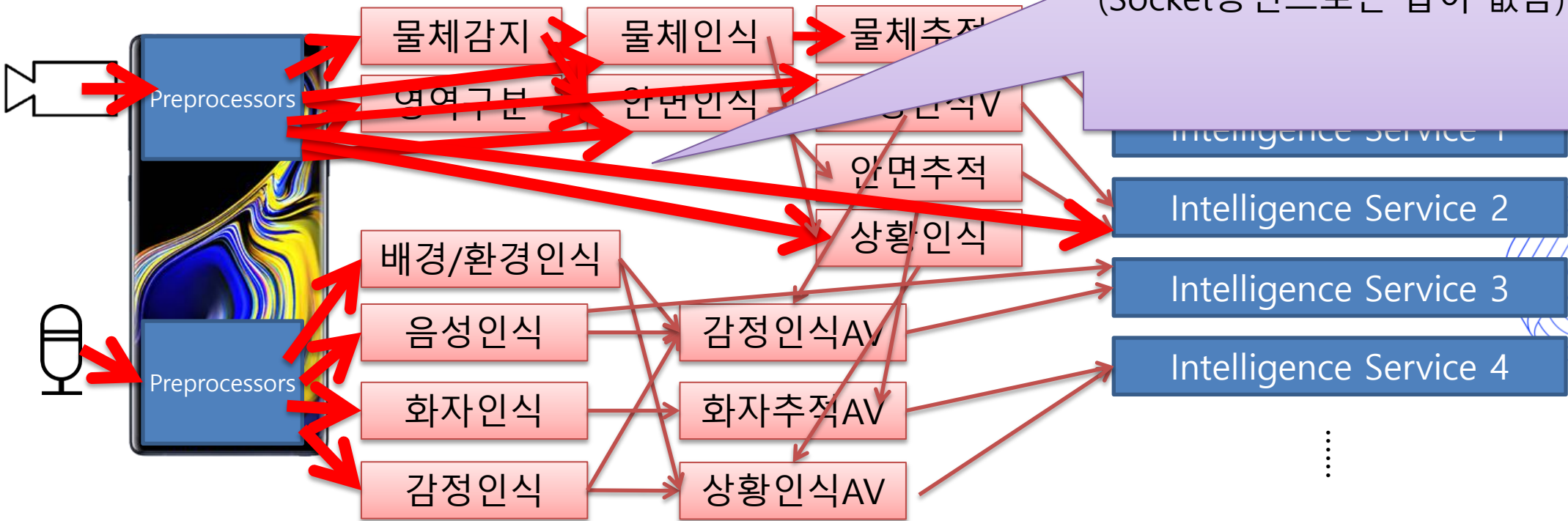
Case 2: Multi-Modal Interactions

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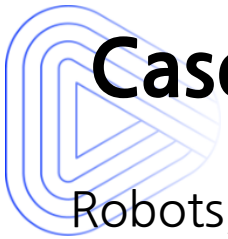
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Issue 1. Data Stream Performance.

데이터 전송 효율성 / 속도문제!
(Socket통신으로는 답이 없음)



설명을 위한 가상 예제입니다.



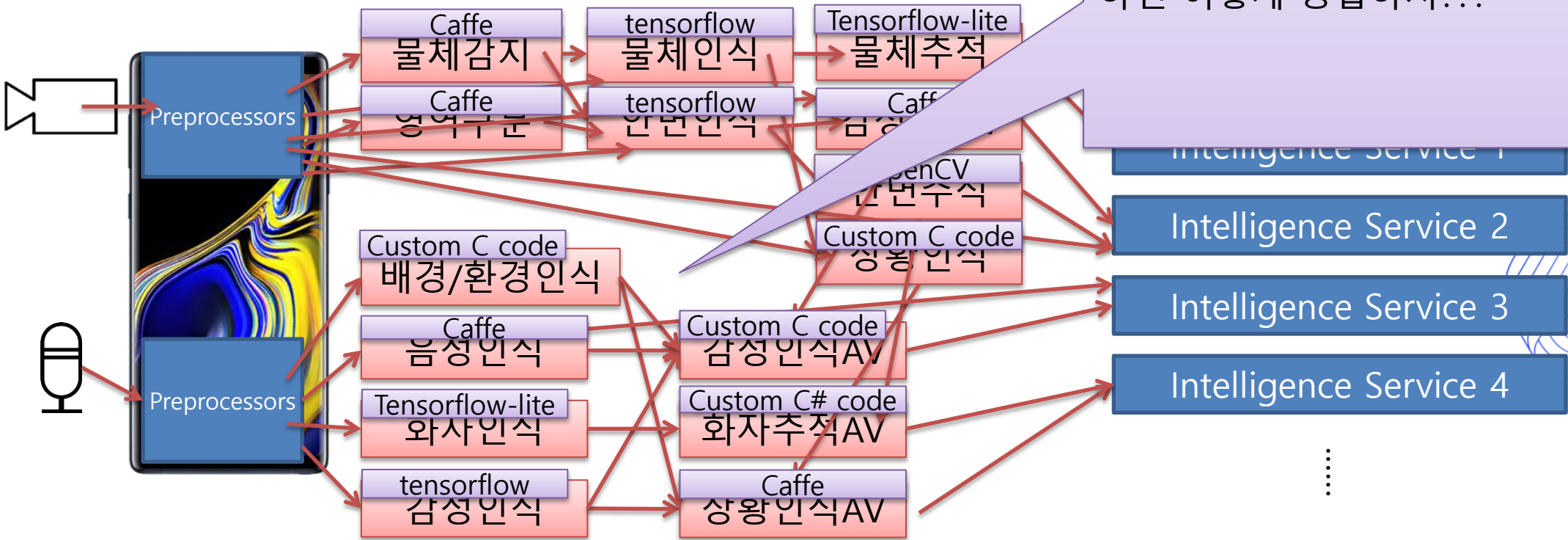
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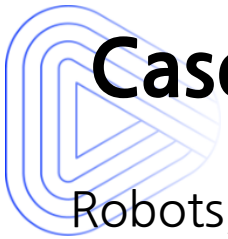
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Issue 2. Neural Network Frameworks

각자 다른 Framework로 Inference
하면 어떻게 통합하지???



설명을 위한 가상 예제입니다.

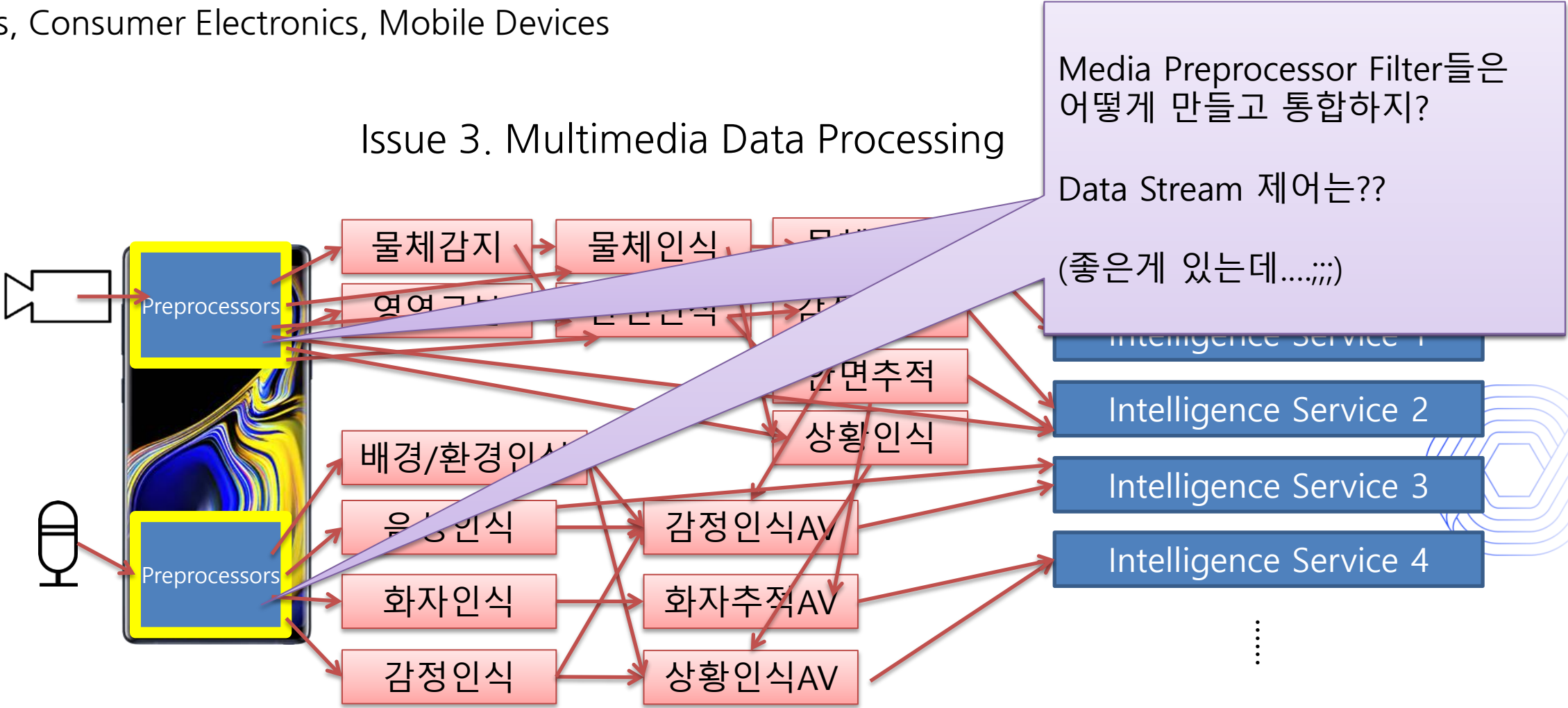


Case 2: Multi-Modal Interactions

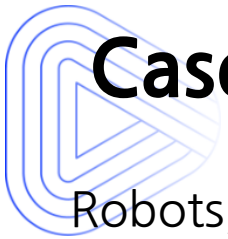
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Issue 3. Multimedia Data Processing



설명을 위한 가상 예제입니다.

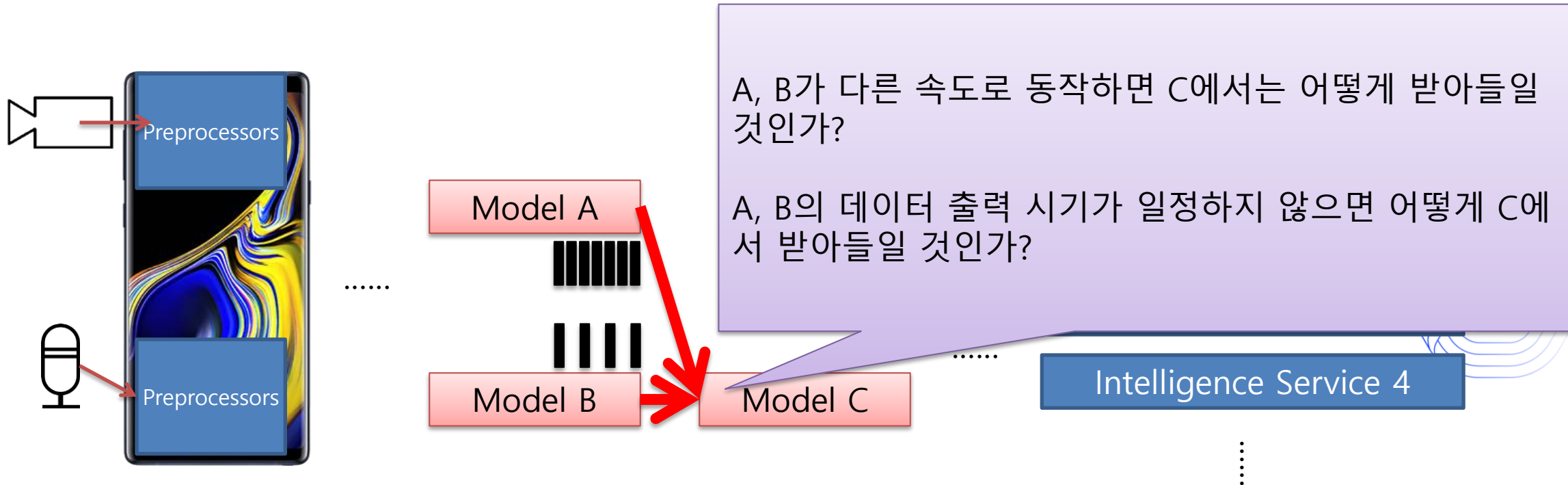


Case 2: Multi-Modal Interactions

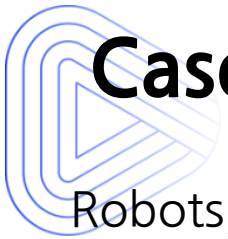
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Issue 4. Data Stream Synchronization



설명을 위한 가상 예제입니다.

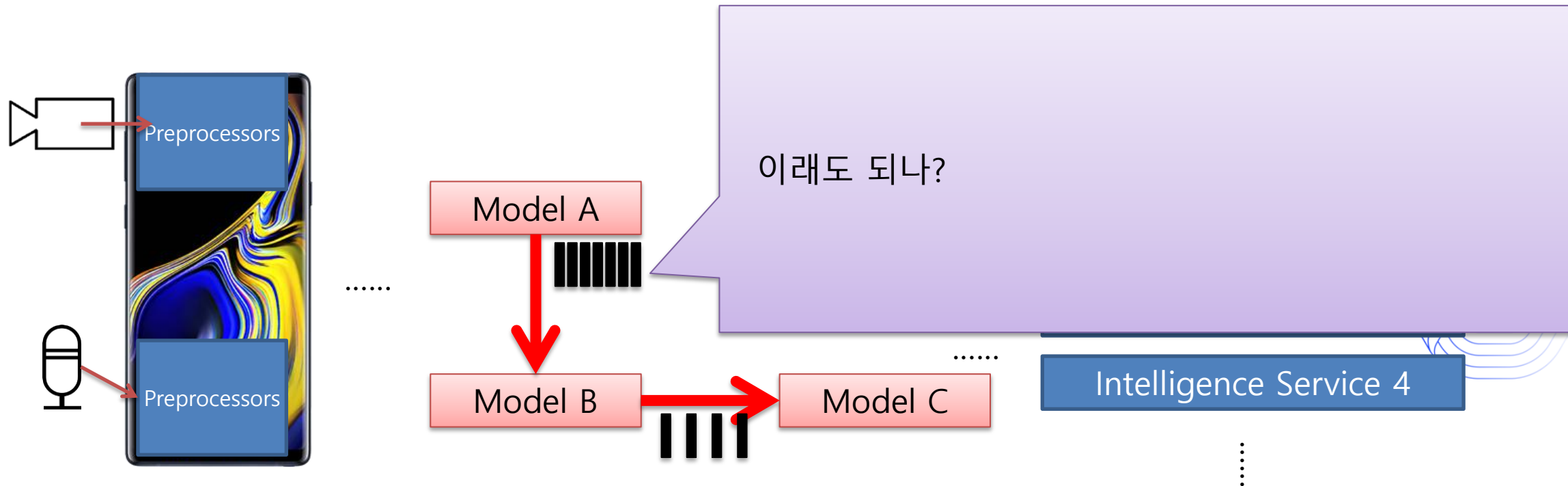


Case 2: Multi-Modal Interactions

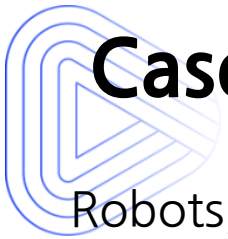
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Issue 5. Data Stream Rate Control



설명을 위한 가상 예제입니다.

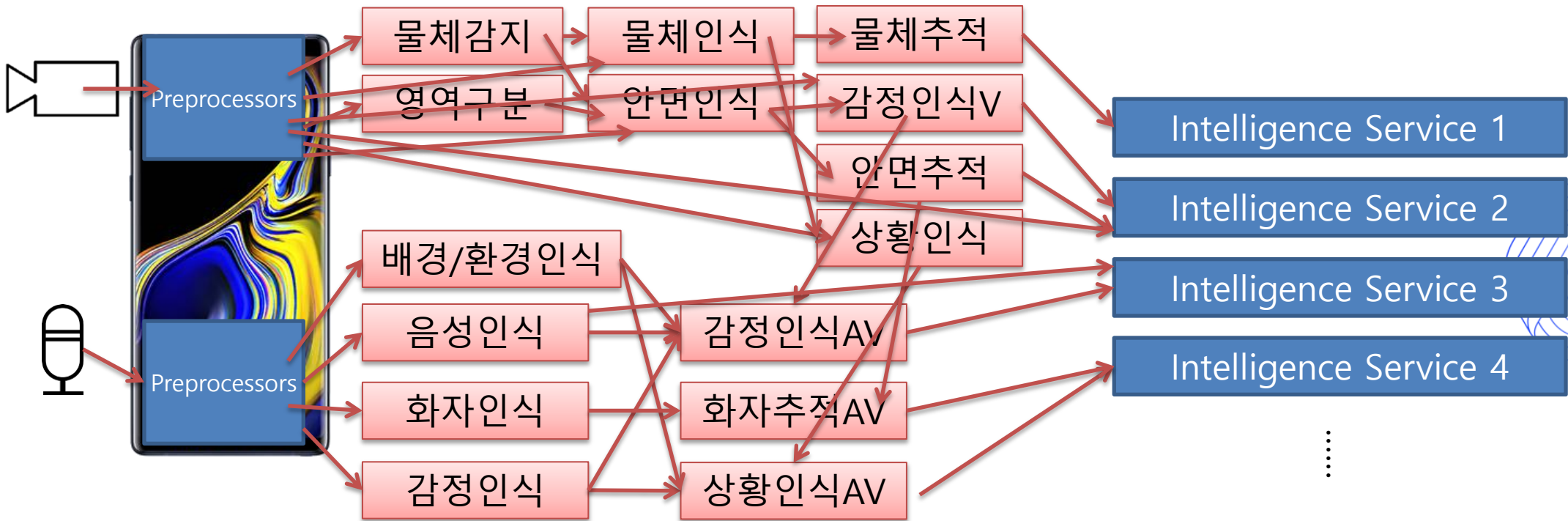


Case 2: Multi-Modal Interactions

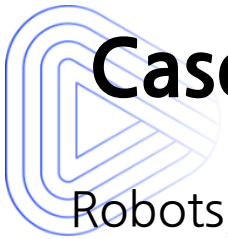
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Issue 6. Dynamic Stream Pipelines



설명을 위한 가상 예제입니다.

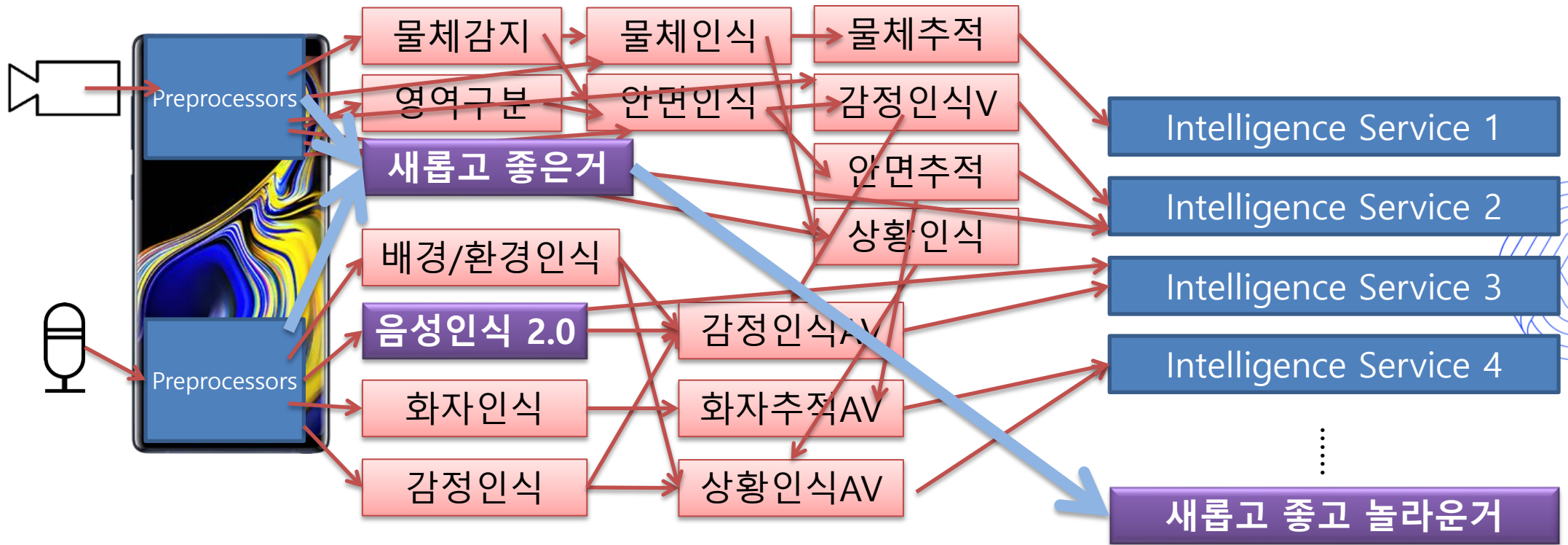


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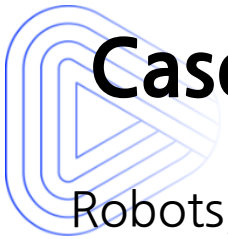
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Issue 6. Dynamic Stream Pipelines



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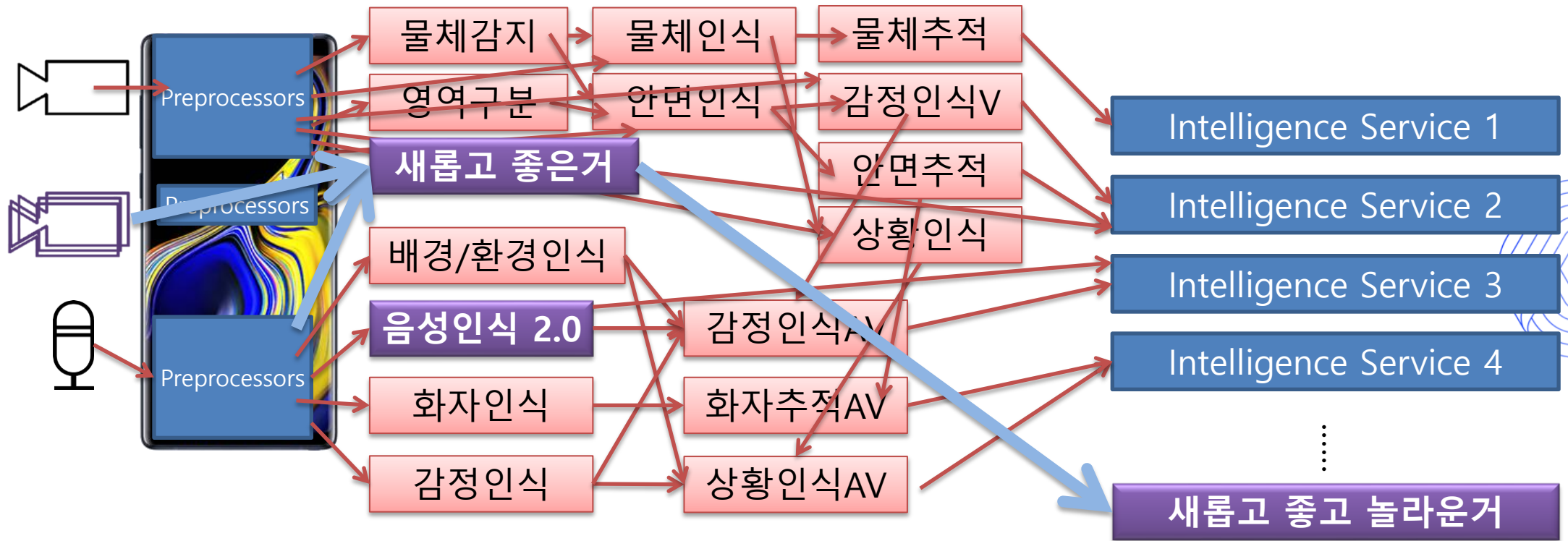


Case 2: Multi-Modal Interactions

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Issue 6. Dynamic Stream Pipelines



설명을 위한 가상 예제입니다.

Motivation

Why nnstreamer?

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DO NOT REINVENT THE WHEEL

Do **NOT** Reinvent the Wheel





Do **NOT** Reinvent the Wheel

gststreamer for intelligence!

What is gstreamer?

- Pipeline 기반 Open Source (LGPL) Multimedia Framework (2001.1. 첫 공개)
- Linux 계열 표준
 - Linux, BSD, macOS, iOS, Windows, ... 지원.
 - TV: 삼성, LG, Sony, ...
- Audio/Video 재생, 기록, 스트리밍/방송, 변환, 편집 등에 광범위하게 사용됨
 - Stream Filter로 사용 가능한 수백가지 Plugin 제공.
 - Plugin을 제작하기 위한 환경 포함
 - C/C++/C#/Java/Python/Perl/CLI/... 에의 표준 API 제공
 - Pipeline 구성을 표현하는 것만으로 동작하는 Application이 완성됨!
 - GUI Tool로 Pipeline 그려서 만들기도...





Do **NOT** Reinvent the Wheel

gstreamer for intelligence!

Why gstreamer?

- Data Stream Pipeline 을 표현, 관리, 실행하는 안정된 표준 Framework
- 언급된 Issue는 이미 수십년 된 Multimedia의 주요 Issue!
 - 이미 해결한 문제 다시 풀지 말자!
- 신경망 == Data Stream Filter!



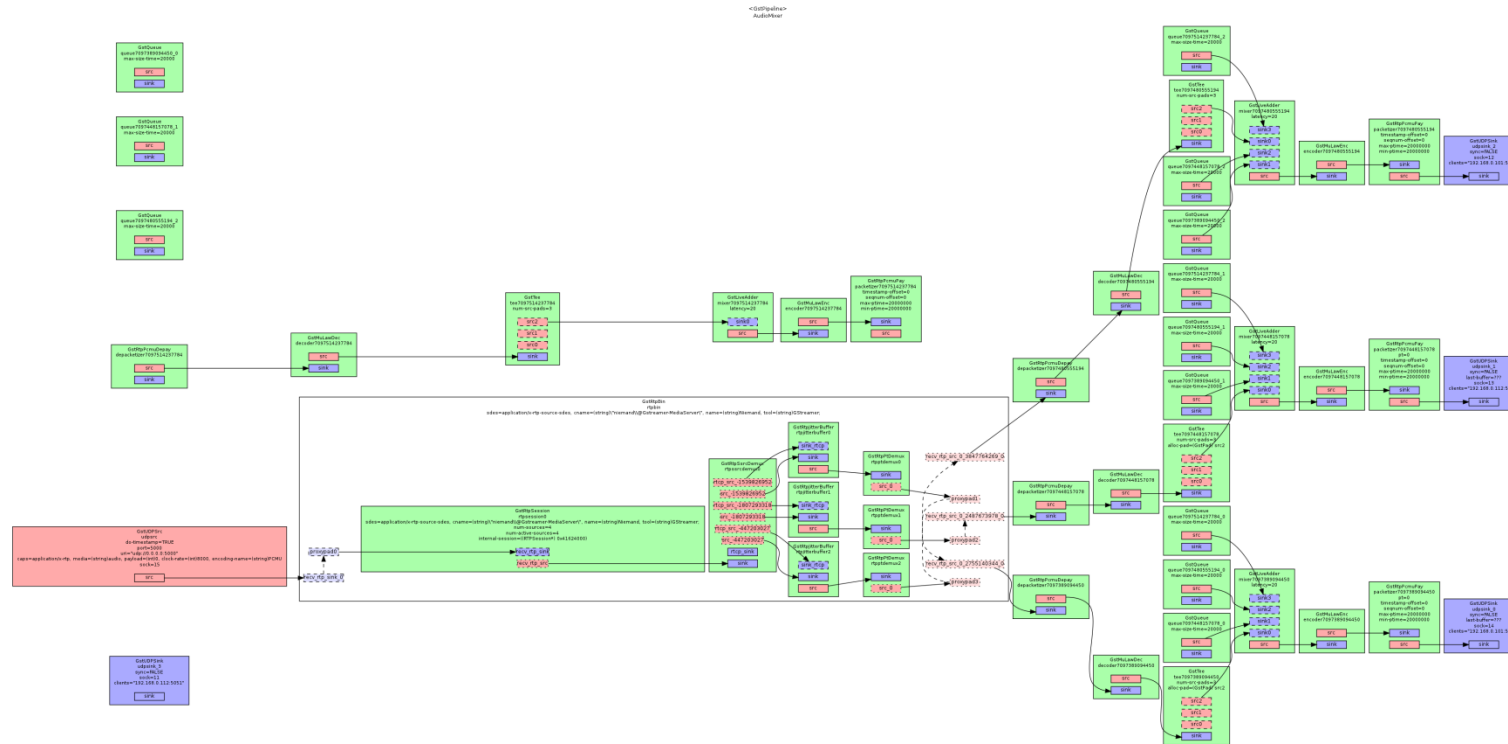


Do **NOT** Reinvent the Wheel

gststreamer for intelligence!

Why gstreamer?

- Configure & run complex stream pipelines, dynamically in run-time!



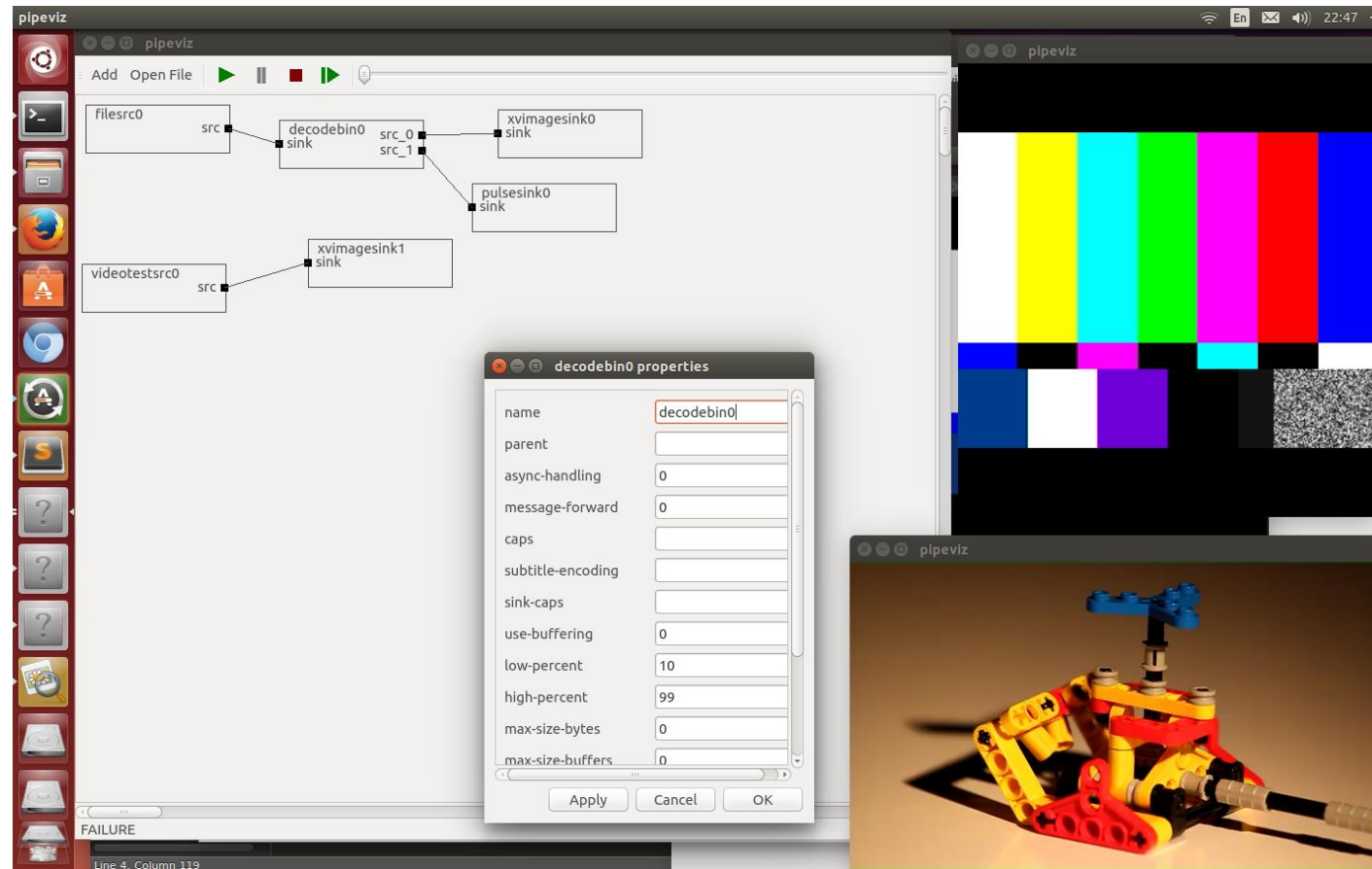


Do **NOT** Reinvent the Wheel

gststreamer for intelligence!

Why gstreamer?

- Configure & run complex stream pipelines... even with GUI tools





ROS vs GStreamer

비교

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	ROS	GStreamer
Community	HIGH (11 years old) Many robot-related plugins	HIGH (17 years old) Many multimedia plugins
Maturity (commercial products)	MEDIUM (Questionable for mass production)	HIGH (Mass Production: TV, Wearable, ...)
OS	Linux , Windows 10	Linux , BSD, Solaris, Android, macOS, iOS, Windows, OS/400
Communication	Socket (ROS2: DDS supported)	Shared memory chunks (faster!)
Distributed System	Fully supported	Experimental (may use ROS as gstreamer plugins)
Sensors	More varying. Many unstable (even sound)	Video/Audio: good / Other sensors: unstable
Neural Network	Custom plugins	Custom plugins → nnstreamer

**Don't Reinvent the Wheel,
PERFECT THE WHEEL!**





Don't Reinvent the Wheel, **Perfect** it!

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gstreamer for intelligence → **nnstreamer**

Gstreamer가 신경망을 이해하여 AI Device의 기반이 되도록 하기 위해...

- 다양한 신경망 Framework / Model 들에게 공통으로 주어질 Data Stream 표준
- 다양한 신경망 Framework / Model 들을 Invoke할 방법
- Audio/Video/Text 외 다른 Data Stream을 GStreamer에서 다루도록 할 방법





Don't Reinvent the Wheel, **Perfect** it!

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→ **nnstreamer**





Don't Reinvent the Wheel, **Perfect** it!

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gstreamer for intelligence → **nnstreamer**

→ **nnstreamer**



License: LGPL 2.1

기존 GStreamer LGPL 코드 재사용

Public Open: 2018.7. (v0.0.1)

<https://github.com/nnsuite/nnstreamer>





Don't Reinvent the Wheel, **Perfect** it!

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gstreamer for intelligence → **nnstreamer**

Gstreamer가 신경망을 이해하여 AI Device의 기반이 되면...

- 신경망 알고리즘 개발자
- 신경망 사용 디바이스/애플리케이션 개발자
- 멀티미디어 개발자





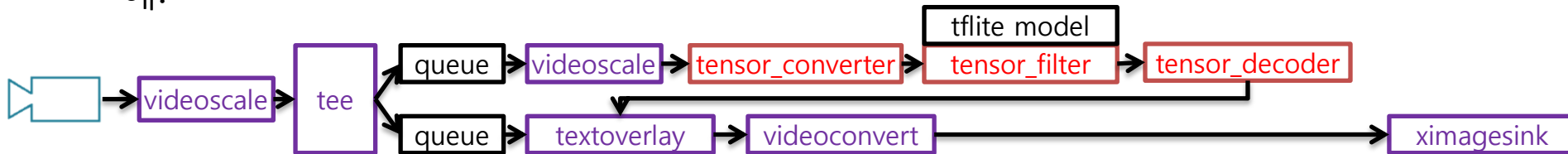
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gstreamer for intelligence → nnstreamer

Gstreamer가 신경망을 이해하여 AI Device의 기반이 되면...

- 신경망 알고리즘 개발자
 - 각종 센서 / 미디어 / 데이터 스트림에 쉽고 즉각적인 통합 → 빠른 테스트 / 프로토타이핑
 - 예:



```
$ gst-launch-1.0 v4l2src name=cam_src ! videoscale ! \ # "cam_src"에서 영상 받아서 scale
video/x-raw,width=640,height=640,format=RGB ! \ # 3x640x480의 RGB Stream
tee name_t_raw \ # Data Stream 분기
t_raw. ! queue ! videoscale ! video/x-raw,width=224,height=224 ! \ # 224x224 RGB 로 전환
tensor_converter ! \ # "tensor" 포맷으로 전환
tensor_filter framework=tensorflow-lite model=mobilenetssd.tflite ! \ # tflite 모델 부름
tensor_decoder mode=labeling option1=labels.txt ! txt. \ # 결과값 해석 방법 지정 → txt
t_raw. ! queue ! textoverlay name=txt ! \ # txt로 들어온 문자열을 합성
videoconvert ! ximagesink # 합성결과를 화면에 출력
```





Don't Reinvent the Wheel, **Perfect** it!

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gstreamer for intelligence → **nnstreamer**

Gstreamer가 신경망을 이해하여 AI Device의 기반이 되면...

- 신경망 사용 디바이스/애플리케이션 개발자
 - 복잡한 Data Stream Pipeline 의
 - 표현이 쉽다
 - 변경, 관리도 쉽다
 - 실행이 효율적이고 빠르다
 - 구성하는 알고리즘/모델의 교체도 쉽다.
 - 다양한 언어/OS에 표준 API 지원
 - C, C++, C#(.NET), Java, Python, Perl, Rust, D, Qt, Haskell, Ruby, CLI (shell)
 - Linux, BSD, Solaris, Android, macOS, iOS, Windows, OS/400
 - 다양한 Input 과 Media Filter의 재사용
 - 기존 SW Platform의 재사용 / 통합.

} 저비용! 고효율!





Don't Reinvent the Wheel, **Perfect** it!

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gstreamer for intelligence → **nnstreamer**

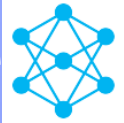
Gstreamer가 신경망을 이해하여 AI Device의 기반이 되면...

- 멀티미디어 개발자
 - 신경망 알고리즘을 Media Filter로 사용하자!

화질 개선, Context 인식, Style 변형,

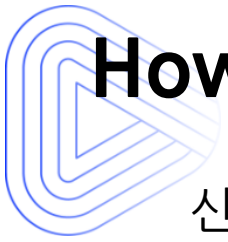


Concepts

How nnstreamer  works?

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How GStreamer handle neural networks?

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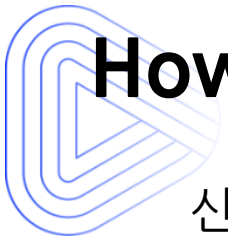
신경망도 또 하나의 Media Filter 일뿐.

그럼 신경망 사이의 데이터는 Video Stream? Audio Stream? Text Stream? ...

- ➔ “Tensor Stream”!



- Tensor : Multi-Dimensional Array



How GStreamer handle neural networks?

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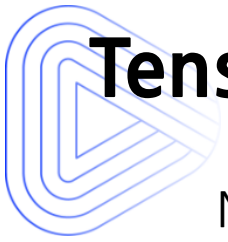
신경망도 또 하나의 Media Filter. Tensor도 또 하나의 Media Type.

Data Stream으로서의 “Tensor”에 대한 정의

```
other/tensor
  framerate: (fraction) [ 0/1, 2147483647/1 ]
  dim1: (int) [1, 65535]
  dim2: (int) [1, 65535]
  dim3: (int) [1, 65535]
  dim4: (int) [1, 65535]      # 아직 5차원 이상은 지원하지 않습니다.
  type: (string) { uint8, int8, uint16, int16, uint32, int32, uint64, int64, float32
, float64 }
```

- Refer: <https://github.com/nnsuite/nnstreamer/wiki/AD%3A-Data-Type%2C-Caps%2C-and-Flow-Design> “**GStreamer data types (pad capabilities)**”



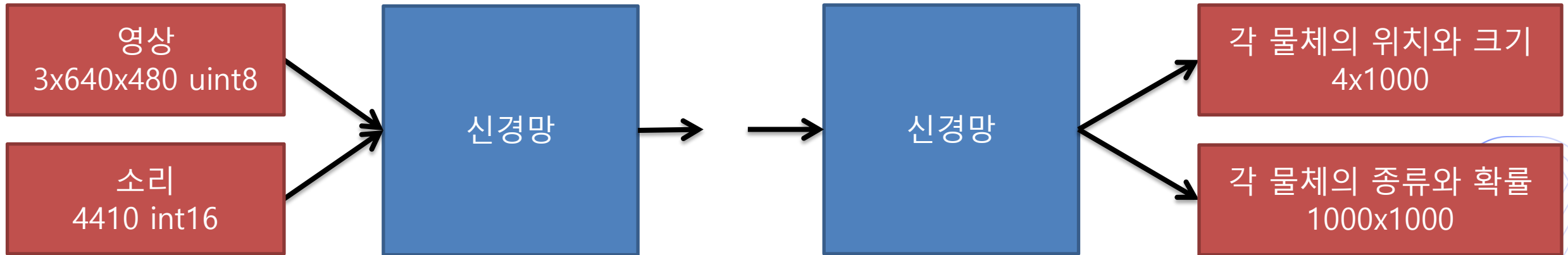


Tensor로 다 될까요?

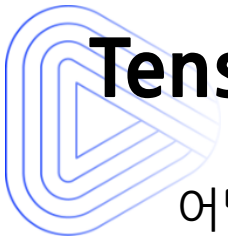
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NO!

Tensor 만으로는 충분하지 않은 경우들...



Tensor가 여러 개 뭉쳐야 하네요...



Tensor의 묶음을 표현하자

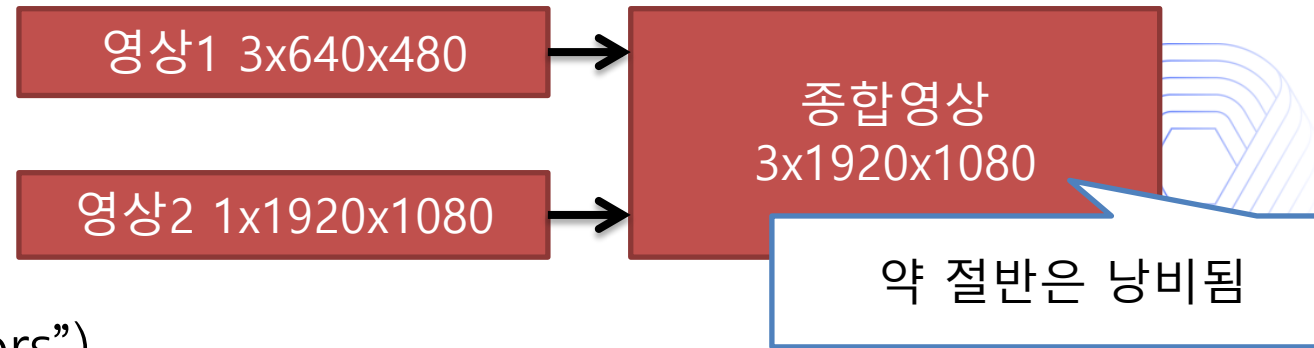
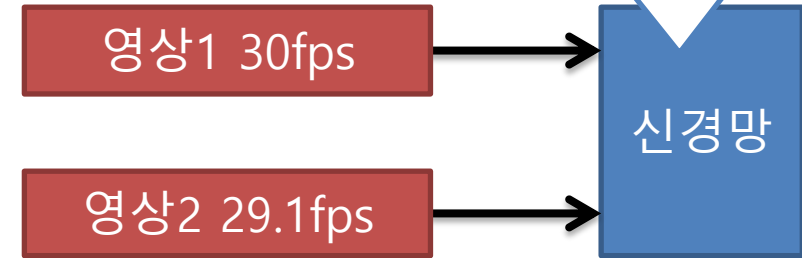
어떻게?

- Tensor는 그대로 두고 Data Stream 여러 개 사용?
 - Synchronization 문제 추가 발생. (GST 기능 적용 곤란)
- Tensor Dimension만 키워서 사용?
 - 메모리 낭비! 성능 저하!
- Tensor의 묶음을 나타낼 표준 제정? (“Tensors”)
 - **nnstreamer** v0.0.2 !

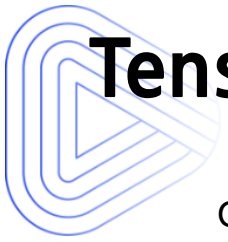


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이런 동기화 문제는 정리
해서 넣어주시지!!!!



약 절반은 낭비됨

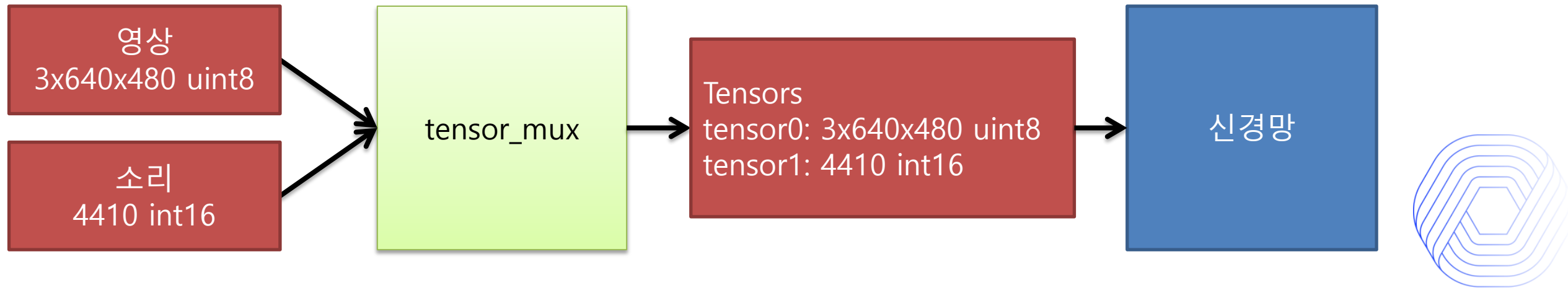


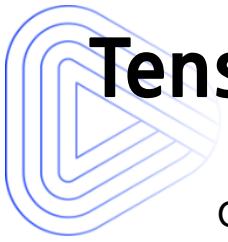
Tensors 로 표현되면...

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other/tensors

Tensor 만으로는 충분하지 않은 경우였던...



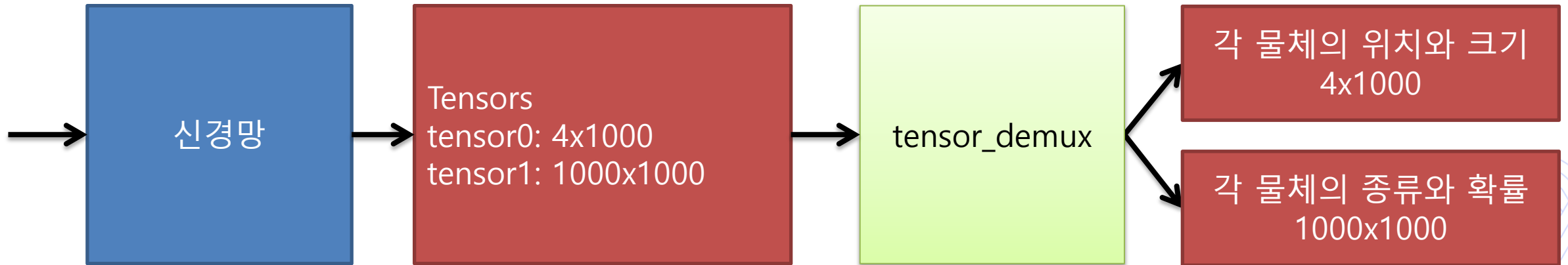


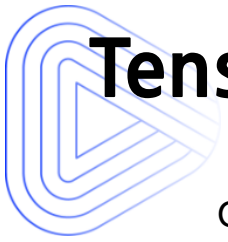
Tensors 로 표현되면...

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other/tensors

Tensor 만으로는 충분하지 않은 경우였던...



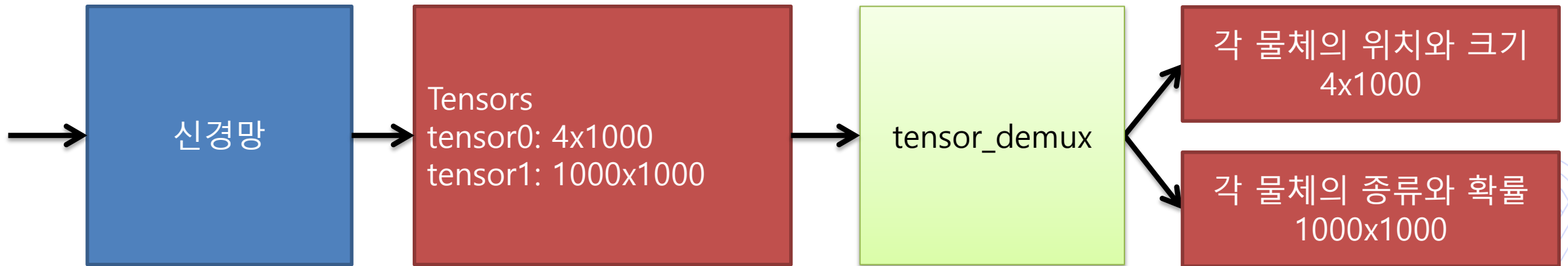


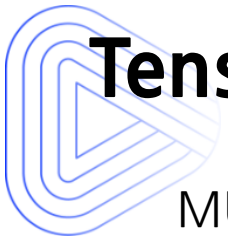
Tensors 로 표현되면...

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other/tensors

Mux / Demux 성능





Tensors 성능 문제?

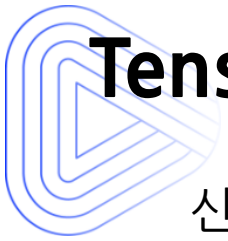
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MUX/DEMUX 때 성능 낭비 없나요?

Memcpy-less mux & demux!

- GstBuffer Multi-memory-chunk 기능 사용.
- 대신. 최대 16개의 Tensor만 뭉쳐집니다.
- 16개 넘기려면 Gstreamer 재빌드 필요. (Hardcoded Parameter)





Tensors. 그 생김새는?

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신경망도 또 하나의 Media Filter. Tensor도 Tensors도 또 하나의 Media Type.

Data Stream으로서의 “Tensor^s”에 대한 정의

```
other/tensors
```

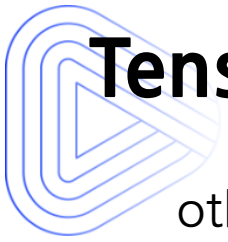
```
    num_tensors = (int) [1, 16] # GST_MAX_MEMCHUNK_PER_BUFFER
    framerate: (fraction) [ 0/1, 2147483647/1 ]
    types = (string) Typestrings
    dimensions = (string) Dimensions
```

```
Typestrings = Typestring | Typestring, Typestrings
Dimensions = Dimension | Dimension, Dimensions
```

```
Typestring = (string) {float32, float64, . . . , int16, uint16, int8, uint8}
Dimension = (string) [1-65535]:[1-65535]:[1-65535]:[1-65535]
```

- Refer: <https://github.com/nnsuite/nstreamer/wiki/AD%3A-Data-Type%2C-Caps%2C-and-Flow-Design> “**GStreamer data types (pad capabilities)**”





Tensor File Format

other/tensorsave

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파일로 tensor / tensors 를 저장하고 로드하기 위한 표준

- 현재 개발중인 v 0.0.2 에서는 구현하지 않습니다.
- 향후 GStreamer 표준으로 제안될 Format Draft는 Wiki에..

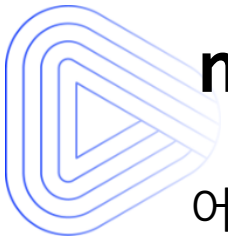


nnstreamer plugins

What nnstreamer  actually does

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nnstreamer plugins

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어떤 종류의 Plugin 들이…?

<https://github.com/nnsuite/nnstreamer/blob/master/Documentation/component-description.md>

- Converter
 - 기존 Media Type → Tensor / Tensor → 기존 Media Type
- Filter
 - Caffe/Tensorflow 등 Framework 나 nnstreamer API로 만들어진 신경망 호출
- Utility
 - Stream Pipeline 제어, Tensor 변환/연산 등
- Connector
 - Gstreamer 외부 요소와의 연결 (비 A/V 센서, ROS, Application, Filesystem 등 src/sink)





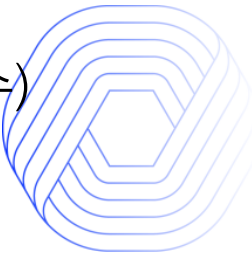
nnstreamer plugins: tensor_converter

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v0.0.1 (video) / v0.0.2 (all)

nnstreamer/gst/tensor_converter/

- Video (video/x-raw)
 - RGB/BGRx 지원. 기타 Colorspace는 향후 지원 할 계획.
 - RGB기준 3:Width:Height uint8 Tensor 출력 (uint8[1][height][width][3])
- Audio (audio/x-raw)
 - Channel:Frames-per-buffer <type> Tensor 출력 (Frames-per-buffer: buffer당 sample 수)
- Text (text/x-raw)
 - Frames-per-buffer uint8 Tensor 출력(Frames-per-buffer: buffer당 text 최대 길이)
- Binary Blob (application/octet)
 - 아무 Binary나 Tensor로 받아 들임. App개발자가 Tensor dimension/type을 지정해야 함.





nnstreamer plugins: tensor_converter

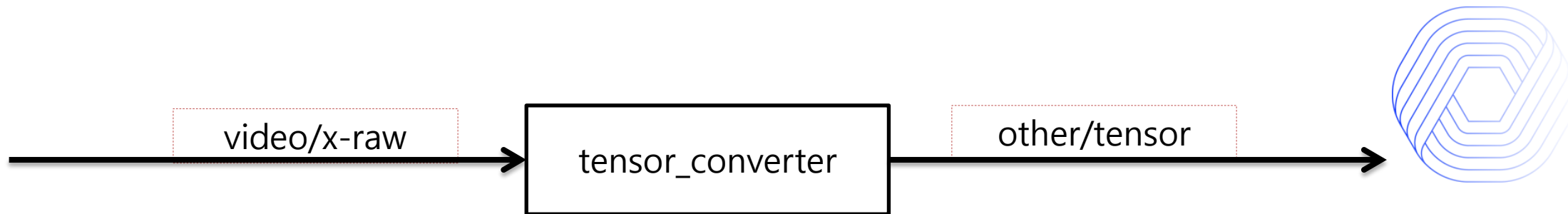
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v0.0.1 (video) / v0.0.2 (all)

nnstreamer/gst/tensor_converter/

- 사용 예:

(video stream) ... ! tensor_converter ! ... (tensor stream)





nnstreamer plugins: tensor_decoder

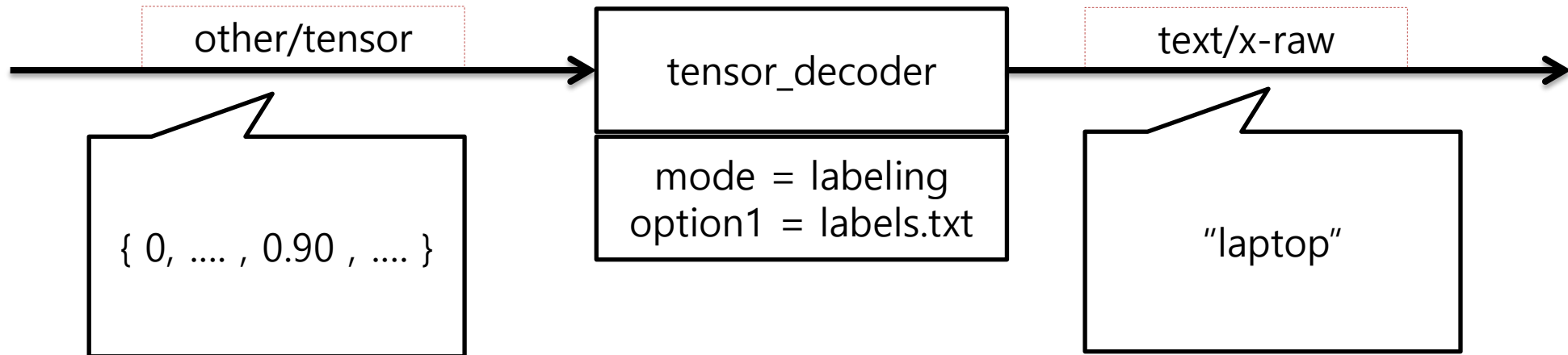
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v0.0.2 (partial)

nnstreamer/gst/tensor_decoder/ (부분 구현)

- 향후 Bounding box, object labeling 등 많이 쓰는 decode 기능 추가. (video output)
- 사용 예:

(tensor stream) ... ! tensor_converter ! ... (text stream)





nnstreamer plugins: tensor_filter

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v0.0.1/v0.0.2

nnstreamer/gst/tensor_filter/

- 각 신경망 Framework 는 하나의 “Subplugin”으로 지원함.
 - 현재 (TF-Lite, Custom) 지원.
 - 향후 Caffe/Caffe2, Tensorflow 추가.
 - Subplugin 형태로써 쉽게 추가 가능함. (별도 .so 파일로 추가)
- Custom subplugin
 - **nnstreamer** API 를 이용해 구현한 신경망 Binary를 사용.
 - “tensor_filter_custom.h” 참조





nnstreamer plugins: tensor_filter

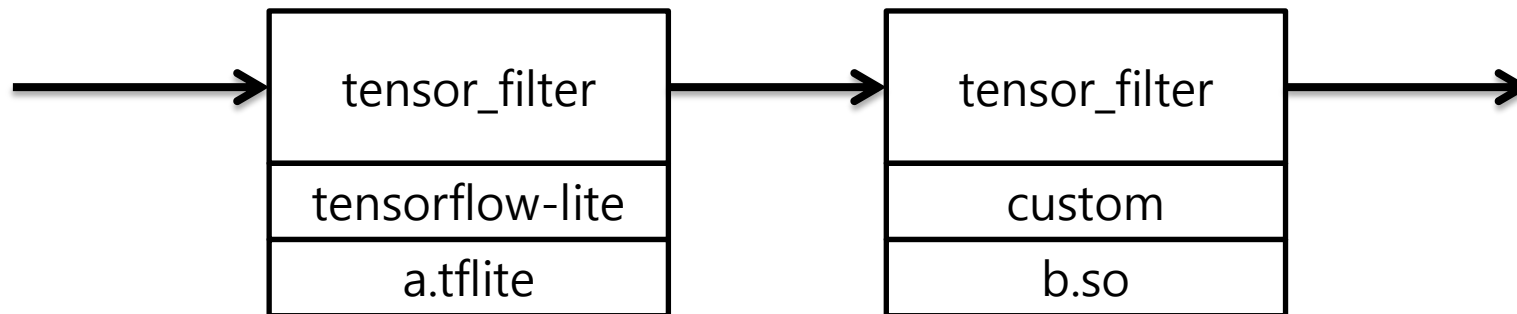
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v0.0.1/v0.0.2

nnstreamer/gst/tensor_filter/

- 사용 예:

... ! tensor_filter framework=tensorflow-lite model=a.tflite !
tensor_filter framework=custom model=b.so ! ...





nnstreamer plugins: utility / tensor_transform

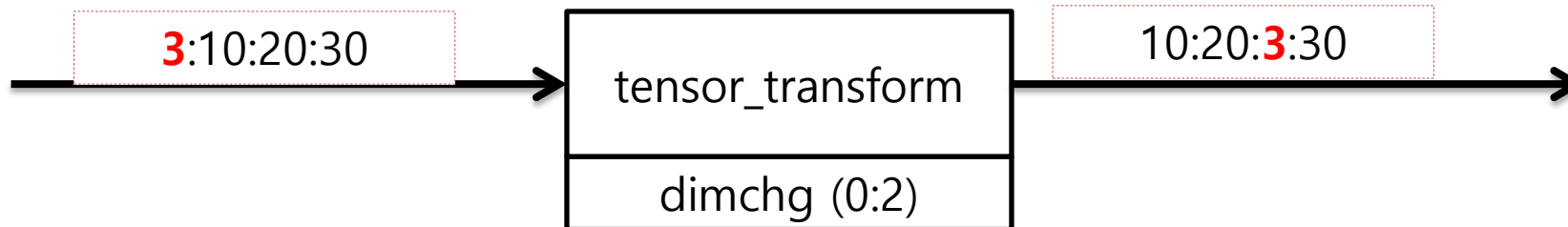
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v0.0.1/v0.0.2

nnstreamer/gst/tensor_transform/ (부분구현)

- Transpose, Type 바꾸기, Normalization 하기, 곱하기, 더하기,
- TODO: SIMD / Multi-op 지원
- 사용 예:

... ! tensor_transform mode=dimchg option=0:2 ! ...





nnstreamer plugins: utility / tensor_mux

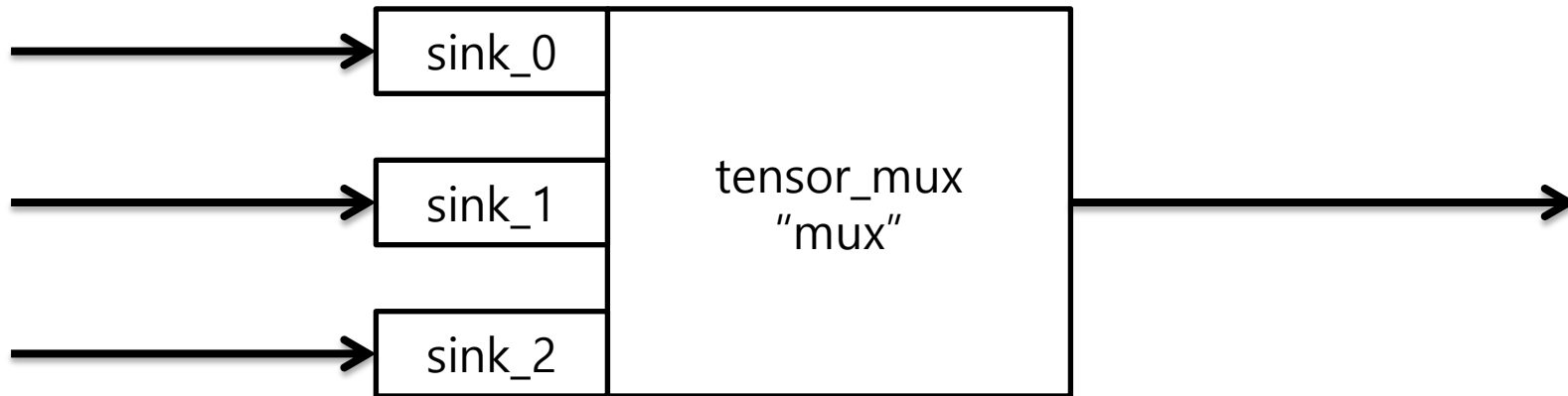
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v0.0.2

nnstreamer/gst/tensor_mux/

- Tensor 들을 묶어서 하나의 Tensors 로 (v 0.0.2 한계: 16)
- 동기화 정책 표현 가능 (v 0.0.3 이후). Malloc 없음.
- 사용 예:

... mux.sink_0 ... mux.sink_1 ... mux.sink_2 ... tensor_mux name=mux ! ...





nnstreamer plugins: utility / tensor_demux

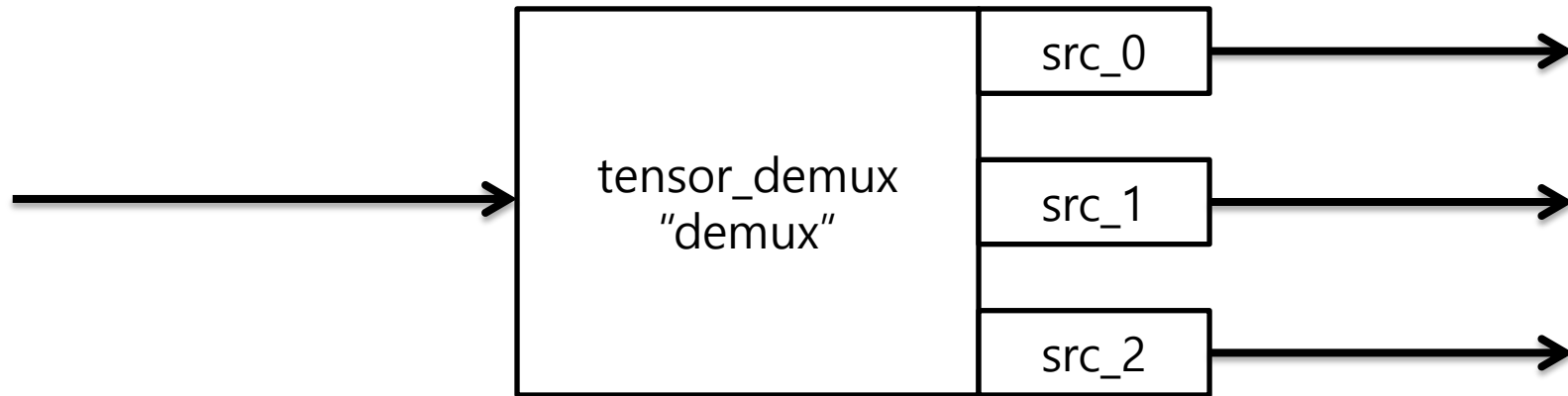
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v0.0.2

nnstreamer/gst/tensor_demux/

- Tensors 들을 풀어서 여러 개의 Tensor 로.
- Malloc 없음. "tensorpick" 옵션을 통해 개별 Tensor 선택 가능.
- 사용 예:

... ! tensor_demux name=demux ... demux.src_0 ... demux.src_1 ... demux.src_2





nnstreamer plugins: utility / tensor_merge

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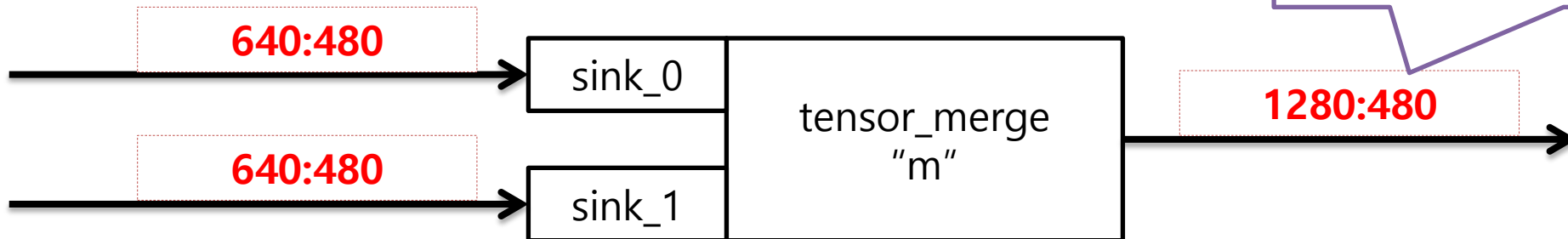
v0.0.2 (partial)

nnstreamer/gst/tensor_merge/ (부분구현)

- Tensor 들을 묶어서 하나의 Tensor 로 (e.g., 좌우 카메라 화면 이어 붙이기)
- 동기화 정책 표현 가능 (v 0.0.3 이후). Memcpy 많음.
- 사용 예:

... m.sink_0 ... m.sink_1 ... tensor_merge name=m ! ...

그 외 "640:960", "640:480:2",
"2:640:480", "640:480/sum",
"640:480/avg", 3개 이상 붙이기, 가
로/세로로 4개 붙이기 등 다양한 기
능이 향후 추가 가능.





nnstreamer plugins: utility / tensor_split

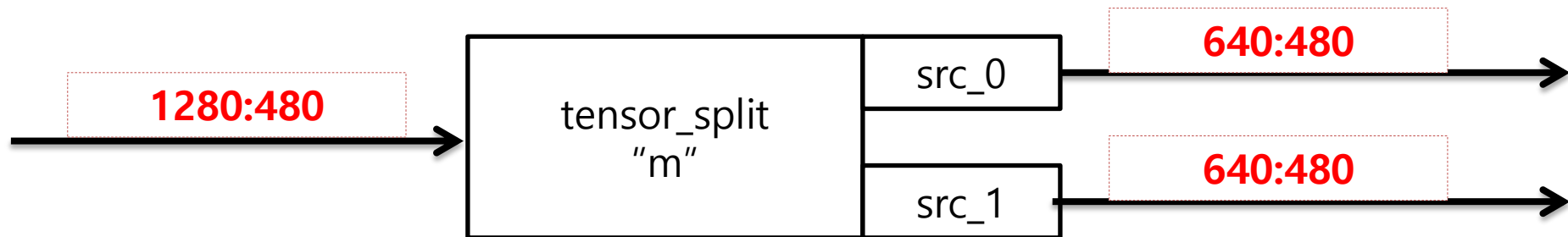
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future item

nnstreamer/gst/tensor_split/ (미구현)

- Tensor 들을 잘라서 여러 개의 Tensor 로 (e.g., 좌우 화면으로 자르기)
- Memcpy 많음.
- 사용 예:

... ! tensor_split name=m ! ... m.src_0 ... m.src_1 ...





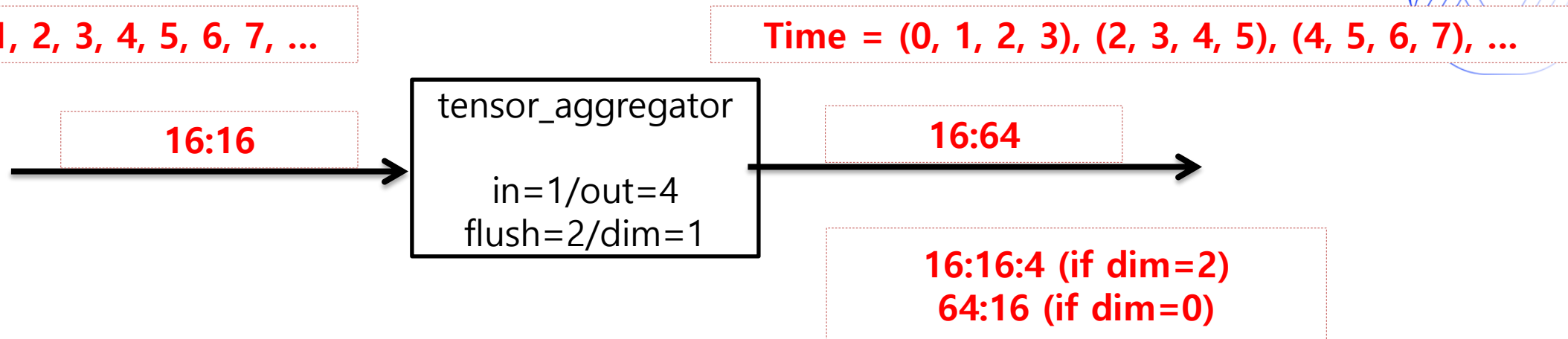
nnstreamer plugins: utility / tensor_aggregator

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v0.0.2

nnstreamer/gst/tensor_aggregator/

- Tensor Stream의 Frame Sequence를 묶어서 제공함.
(e.g., 현재부터 과거 10개의 Frame을 한번에 묶어서 신경망에 입력)
- 사용 예:
... ! tensor_aggregator frames-out=4, frames-flush=2, frames=dim=1 ! ...





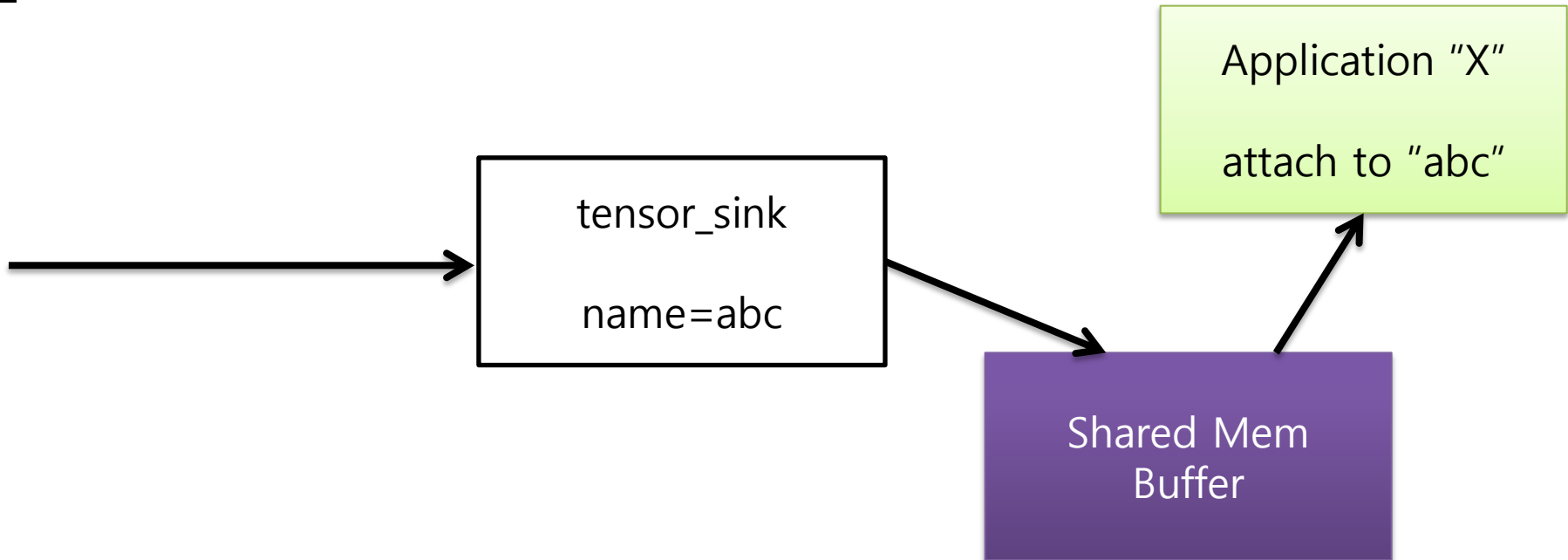
nnstreamer plugins: connector / tensor_sink

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v0.0.1

nnstreamer/gst/tensor_sink/

- Tensor Stream의 Frame들을 Shared Mem으로 외부 App에게 제공
- 사용 예:
... ! tensor_sink name=abc





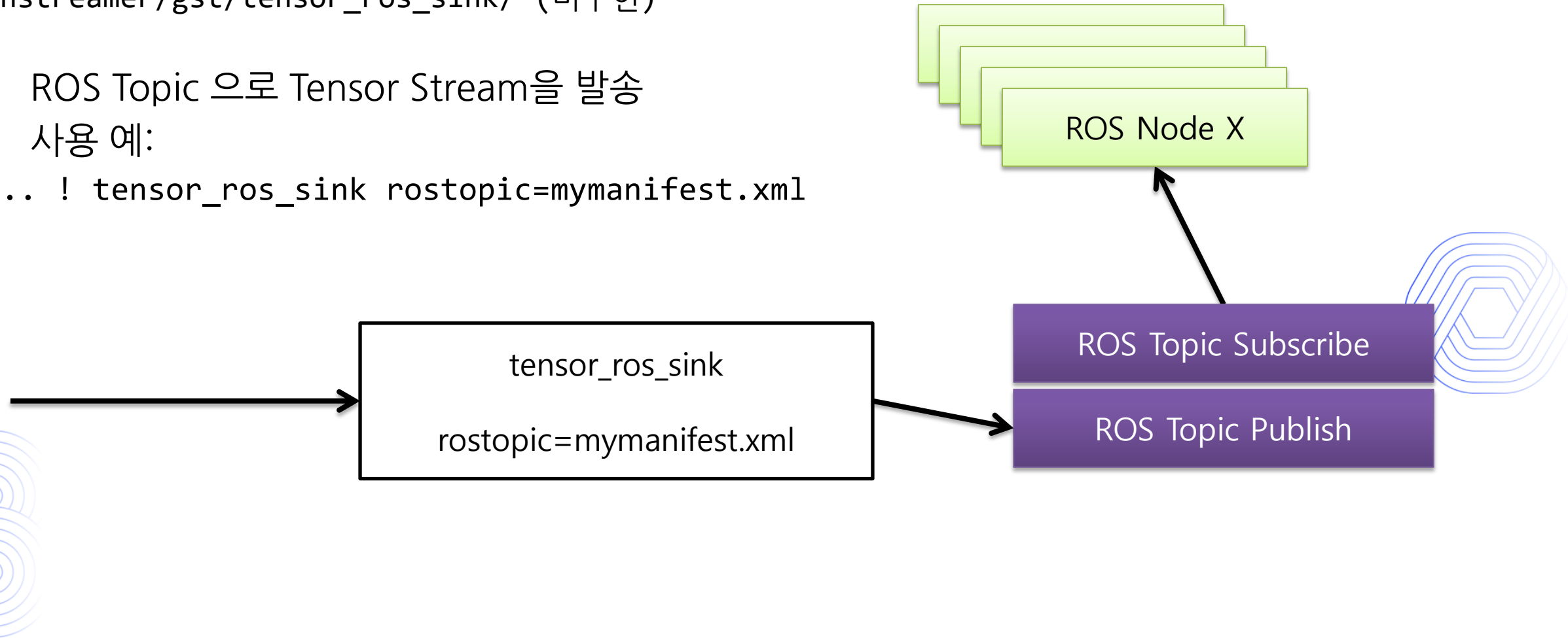
nnstreamer plugins: connector / tensor_ros_sink

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Future Work

nnstreamer/gst/tensor_ros_sink/ (미구현)

- ROS Topic 으로 Tensor Stream을 발송
- 사용 예:
... ! tensor_ros_sink rostopic=mymanifest.xml





nnstreamer plugins: connector / tensor_ros_src

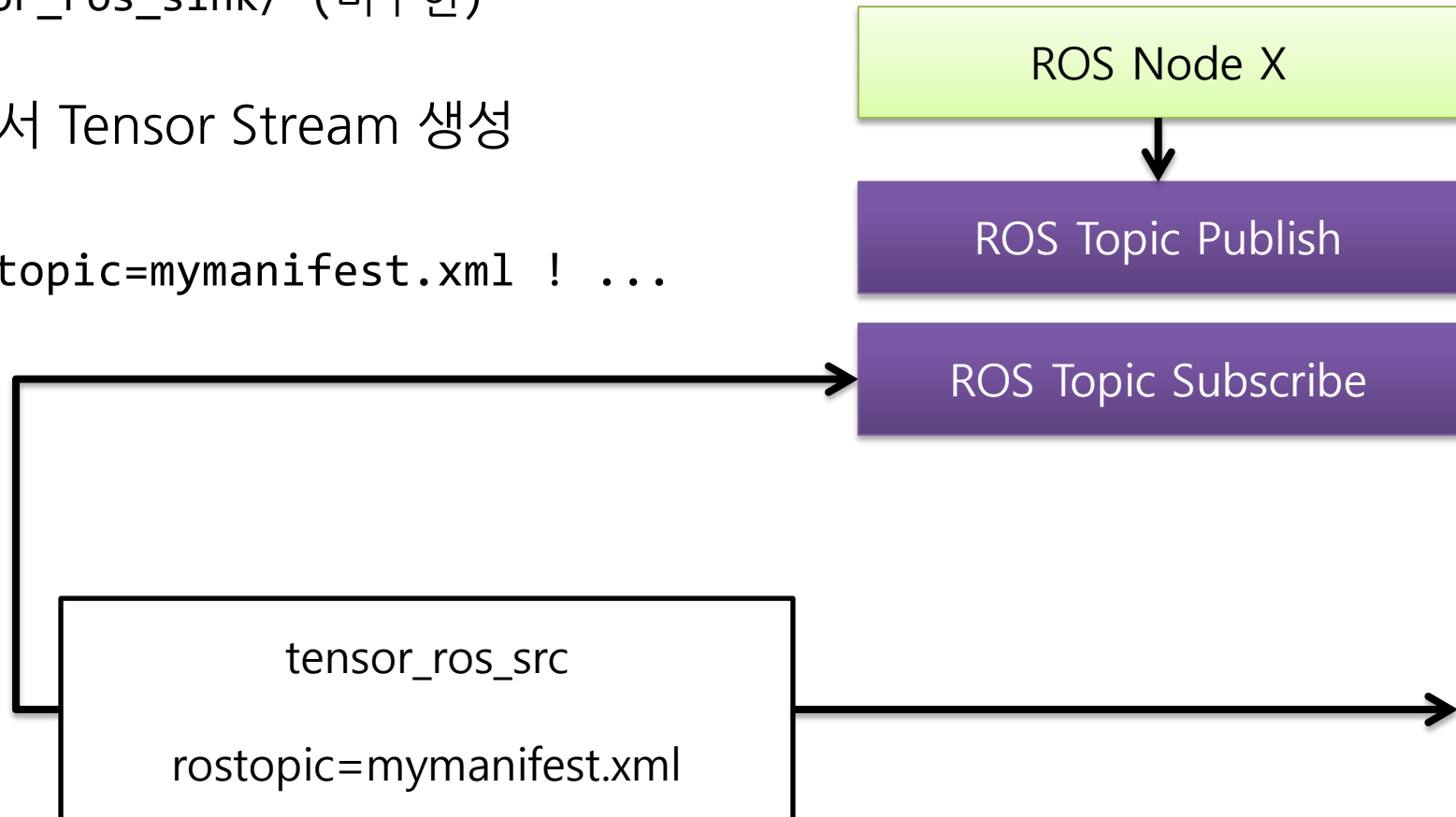
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Future Work

nnstreamer/gst/tensor_ros_sink/ (미구현)

- ROS Topic 받아와서 Tensor Stream 생성
- 사용 예:

tensor_ros_src rostopic=mymanifest.xml ! ...





nnstreamer plugins: connector / tensor_src

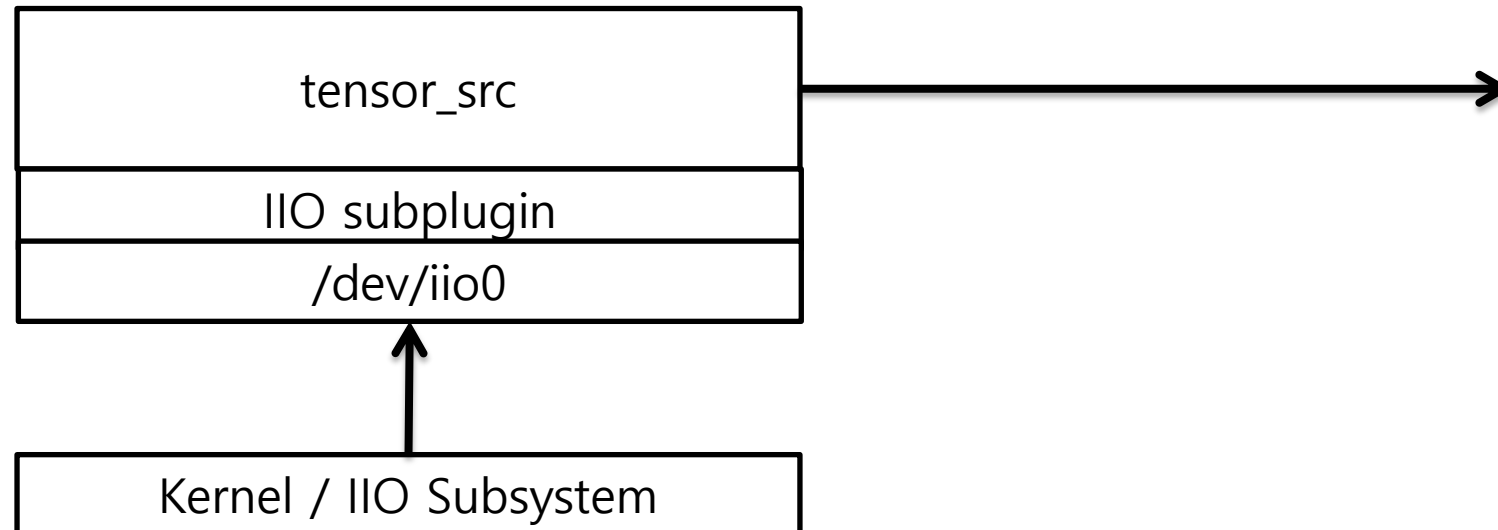
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Future Work

nnstreamer/gst/tensor_ros_src/ (미구현)

- 기타 Input Source / Sensor로부터 Tensor Stream 생성
- 사용 예:

tensor_src mode=IIO node=/dev/iio0! ...





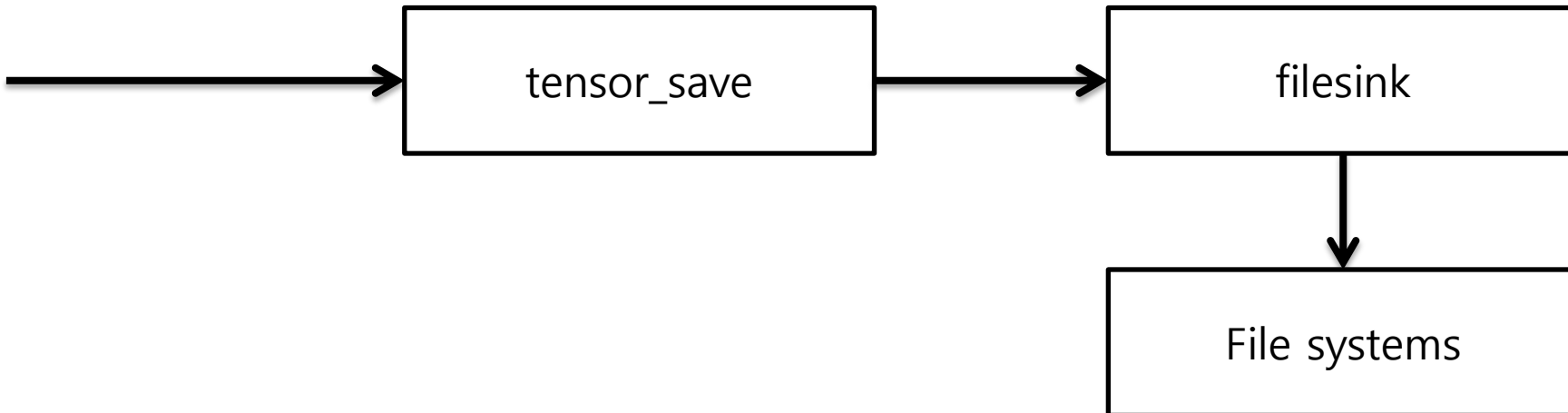
nnstreamer plugins: connector / tensor_save

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Future Work

nnstreamer/gst/tensor_saveload/ (미구현)

- Tensor Stream을 File 저장을 위한 Headed Data로 전환
- 사용 예:
... ! tensor_save ! filesink location=abc.tnsr





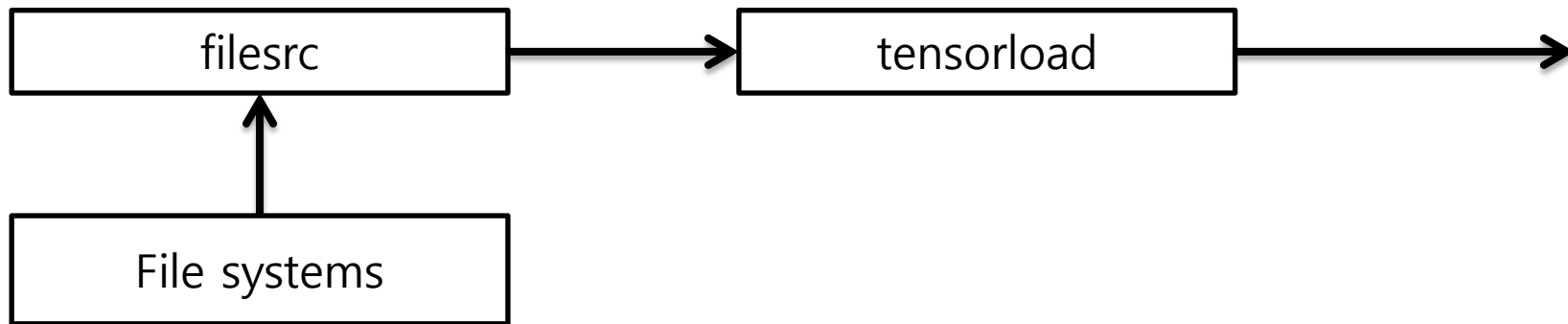
nnstreamer plugins: connector / tensor_load

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Future Work

nnstreamer/gst/tensor_saveload/ (미구현)

- File 로부터 Tensor Stream (tensor/tensors) 을 생성
- 사용 예:
 1. filesrc location=abc.tnsr ! tensor_loadsave ! ...
 2. filesrc location=abc.tnsr ! autodecode (“tensorsave” Gstreamer 표준 채택시)



Usage example

nnstreamer  in action

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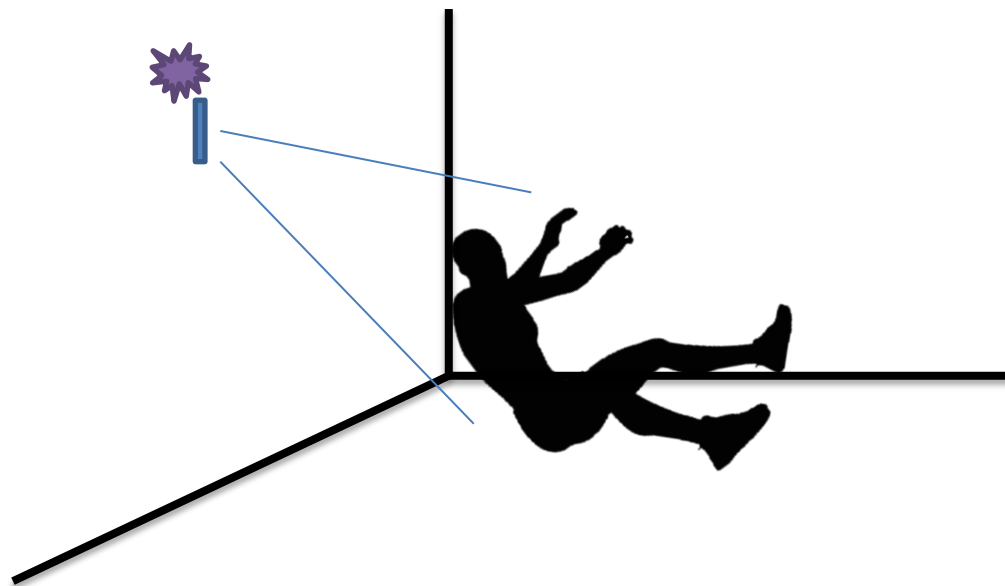
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Fall Detection Device, Elderly Care

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실 적용 사례

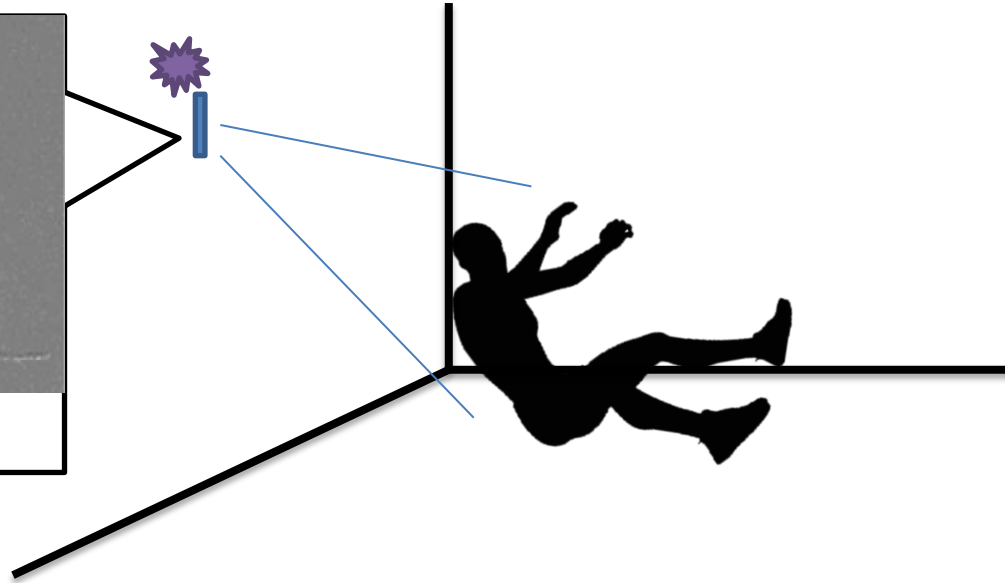
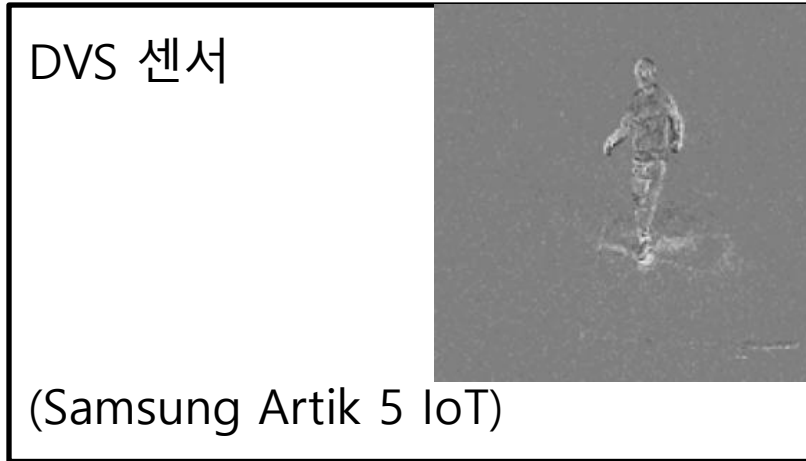




Fall Detection Device, Elderly Care

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실 적용 사례



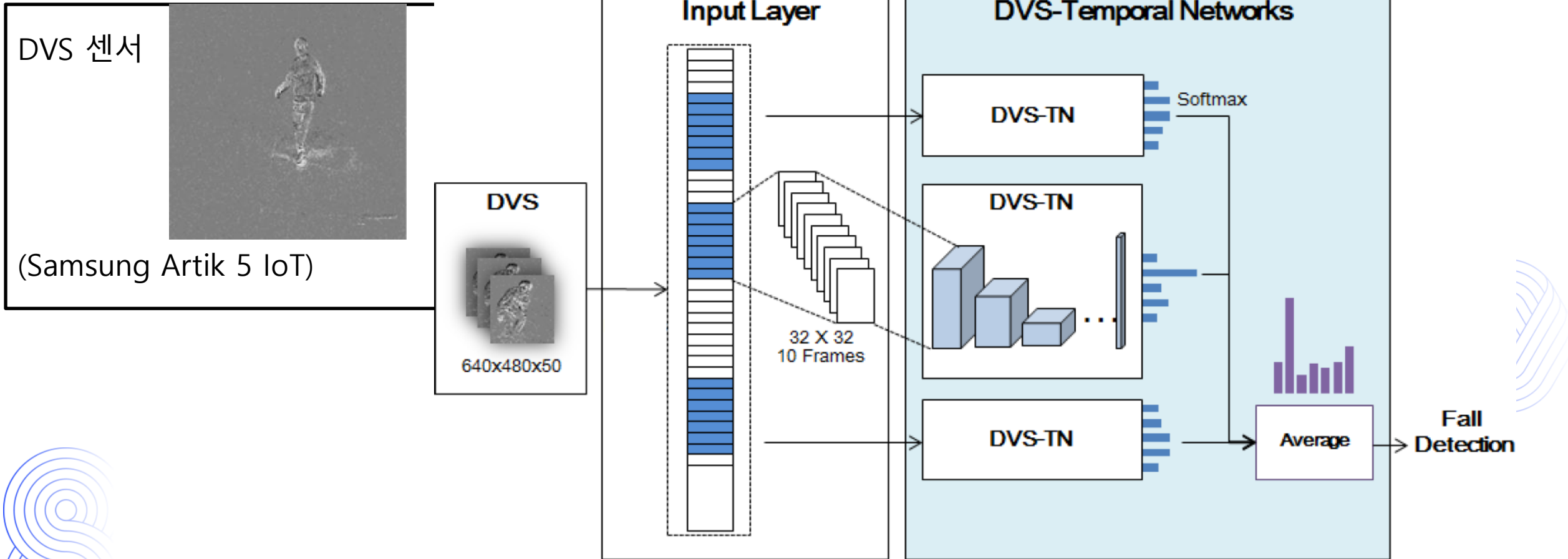
- H. Lee, et. al., “Embedded Real-Time Fall Detection Using Deep Learning For Elderly Care”



Fall Detection Device, Elderly Care

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실 적용 사례



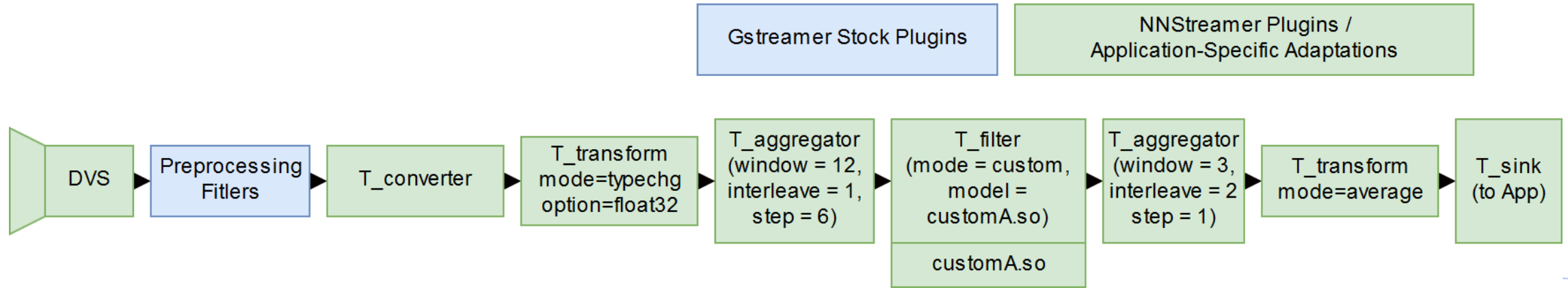
• H. Lee, et. al., “Embedded Real-Time Fall Detection Using Deep Learning For Elderly Care”



Fall Detection Device, Elderly Care

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실 적용 사례



- nnstreamer 적용으로 생산성 (수천라인 → 수십라인) / 성능 (x ~4) 대폭 향상

➔ 신규 기능 / 신경망 추가할 여력 발생

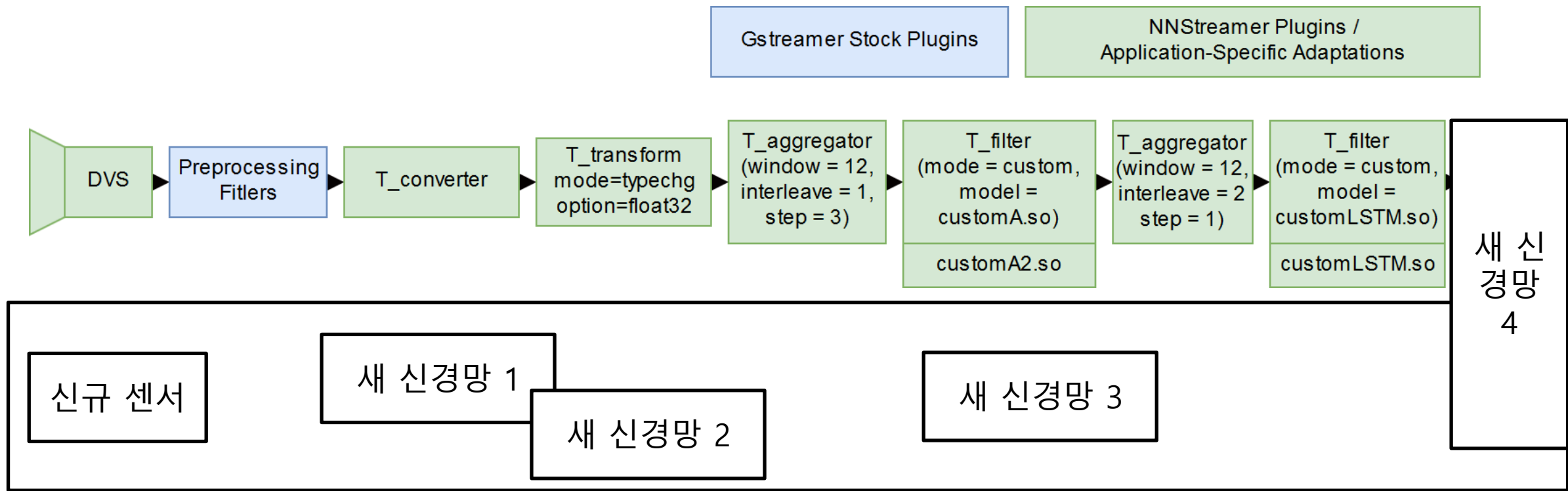




Fall Detection Device, Elderly Care, “Next-Gen”

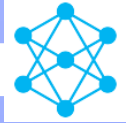
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실 적용 사례



- LSTM 적용, 신경망 상호 작용 구조 변경, 신규 센서 및 신경망 추가 등.
- 매우 빠른 시간 내에 고성능/저비용 Solution 제작.

Demonstration

nnstreamer  live action

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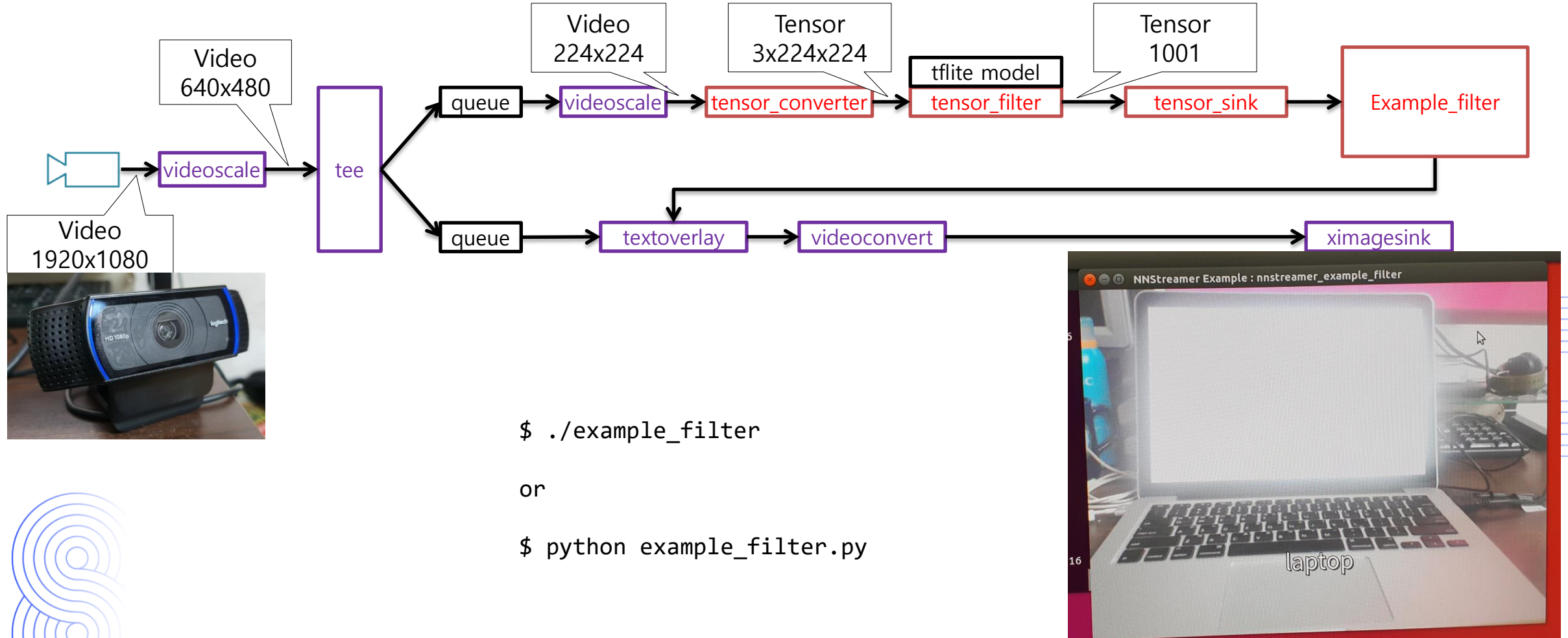
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Demonstration

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<https://github.com/nnsuite/nnstreamer> : nnstreamer_example/example_filter (C & Python)

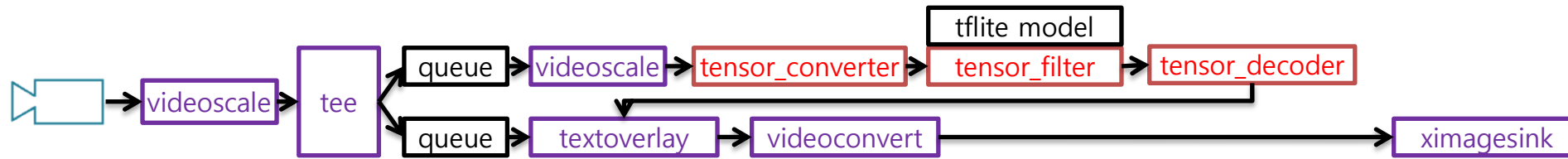




Demonstration

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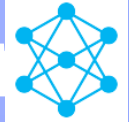
nnstreamer @ Ubuntu Demo



```
$ gst-launch-1.0 v4l2src name=cam_src ! videoscale ! \ # "cam_src"에서 영상 받아서 scale
video/x-raw,width=640,height=640,format=RGB ! \ # 3x640x480의 RGB Stream
tee name=t_raw \ # Data Stream 분기
t_raw. ! queue ! videoscale ! video/x-raw,width=224,height=224 ! \ # 224x224 RGB 로 전환
tensor_converter ! \ # "tensor" 포맷으로 전환
tensor_filter framework=tensorflow-lite model=mobilenetssd.tflite ! \ # tflite 모델 부름
tensor_decoder mode=labeling option1=labels.txt ! txt. \ # 결과값 해석 방법 지정 → txt
t_raw. ! queue ! textoverlay name=txt ! \ # txt로 들어온 문자열을 합성
videoconvert ! ximagesink # 합성결과를 화면에 출력
```



CI / CD & How to Contribute

How nnstreamer  is developed
How you can contribute

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nnstreamer CI: TAOS-CI

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Continuous Integration (CI)

CI system을 통해 모든 개별 Commit은 자동으로 검수

- Regression 방지
 - Build & Unit Test
- Coding Style/Rule 강제
- Integration 확인
 - Tizen/Ubuntu Packaging & UI App Test

- G. Lim, M. Ham, J. Moon, W. Song, S. Woo, S. Oh, "TAOS-CI: Lightweight & Modular Continuous Integration System for Edge Computing", ICCE, 2019 (Accepted)





nnstreamer CD

Continuous Deployment (CD)

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CD system을 통해 설치용 Package 상시 릴리즈

- Ubuntu: launchpad PPA
- Tizen: OBS
- 향후 지속 추가





How to Contribute?

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You are welcomed to contribute!

Github (github.com/nnsuite/nstreamer) 에서 개발 진행

- Issue 를 통해 개발할 기능, 해결할 버그를 등록.
- Pull Request를 통해 해당 Issue를 해결하는 Code를 등록.
 - Coding Style/Rule 및 모든 Build/Unit/Integration Test를 통과해야 함.
 - Submit 전에 미리 빌드/테스트 해주세요!
 - 신규 기능은 해당 기능을 위한 Unit Test를 포함하는 Commit도 추가해야 함.
 - Bug Fix는 해당 Bug를 확인하는 Unit Test를 추가해야 함.
 - Maintainer/Reviewer와의 적극적인 소통 권장



Work In Progress / Plans

Future of `nnstreamer`



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Work-In-Progress & Plans

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OS Integration

- 2018
 - Tizen: the standard target. Tested: arm/x64 / Built (no test): arm64/x86-32
 - Ubuntu: release via PPA. Tested: x64
- 2019
 - Tizen: full SW platform integration & release
 - Android: secondary standard target. Tested: arm or arm64
 - Windows/macOS: built tested only: x64
 - Other Linux Distro: release via openSUSE OBS.



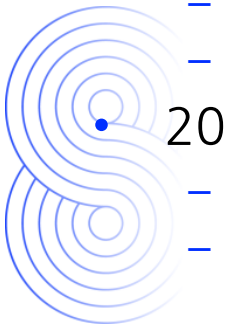


Work-In-Progress & Plans

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Features

- 2018
 - Tensor_filter: tensorflow
 - Tensor_ros_sink: send ROS topics (pub)
 - Tensor_decoder: bounding boxes, object labeling
 - Tensor_merge: more options required
- 2019
 - Tensor_filter: caffe/caffe2, LSTM (recurrent net) support
 - Tensor_transform: SIMD support. Multi-op support
 - Tensor_source: IIO sensors, LIDAR/RADAR support
 - Tensor_ros_source: receive ROS topics (sub): “FULLY DISTRIBUTED GST PIPELINE!”
 - Tensor_decoder: more incoming!
 - Tensor_save/load
 - Try to become **gst-plugins-good**!
- 2020
 - Support training phases
 - Multi-computer/board support



Conclusion

nnstreamer



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Recommended Applications

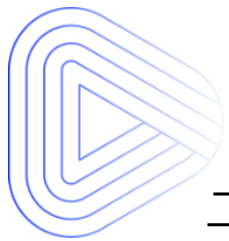
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혹시 이런 것을 만드신다면...

- Cloud/Server가 아닌 Device에서 직접 신경망 처리
- 실시간으로 생성되는 Audio/Video Stream에 신경망 처리
- 한 Device 혹은 한 Stream Pipeline 내에 여러 신경망을 혼합 사용
- 기존 Audio/Video Media Filter들의 재사용
- Stream Topology가 복잡하거나 동적임
- 고성능 Data Stream 처리 필요
- ...



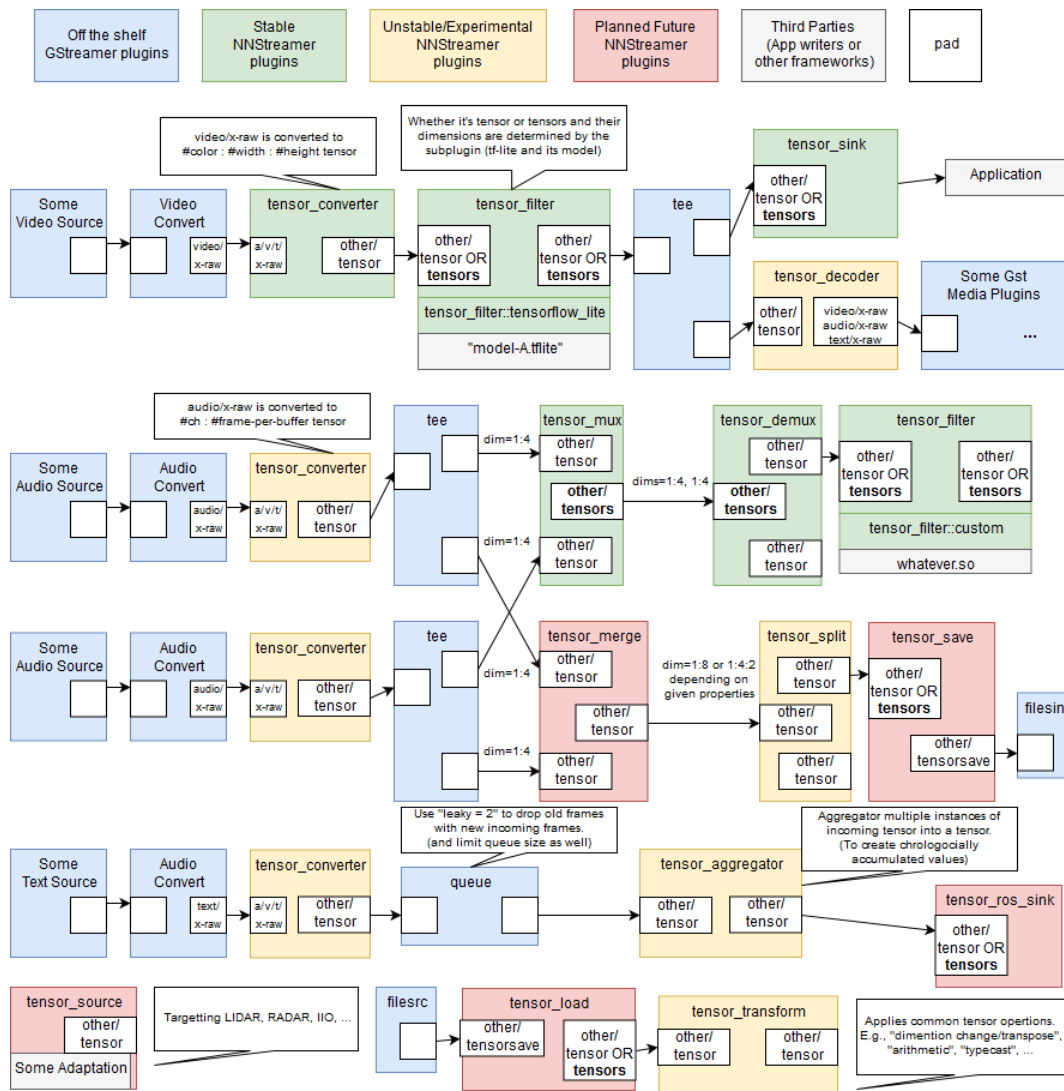
물론, 그 모든 것을 다 잘 직접 구현해서 쓰실 수 있으시면 상관 없습니다. ^^
그런데... “Don’t Invent the Wheel!”



nnstreamer Cheat Sheet

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그 플러그인들 어디다 어떻게 쓰지요??



<https://github.com/nnsuite/nnstreamer/wiki/AD%3A-Overall-Design>

nnstreamer github 내 Wiki page 참조



THANK YOU

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