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for smart digital solutions

Semantic labelling for AD development & validation

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ABOUT US

Non-for-Profit Private Research Institution in **Artificial Intelligence, Visual Computing & Interaction**

www. vicomtech.org

+160 RESEARCHERS

+60 Ph.D

24% H2020 & INTERNATIONAL

46% INDUSTRIAL R&D

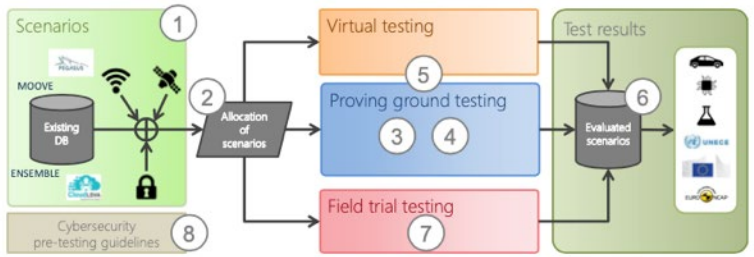
Semantic labelling for AD development & validation

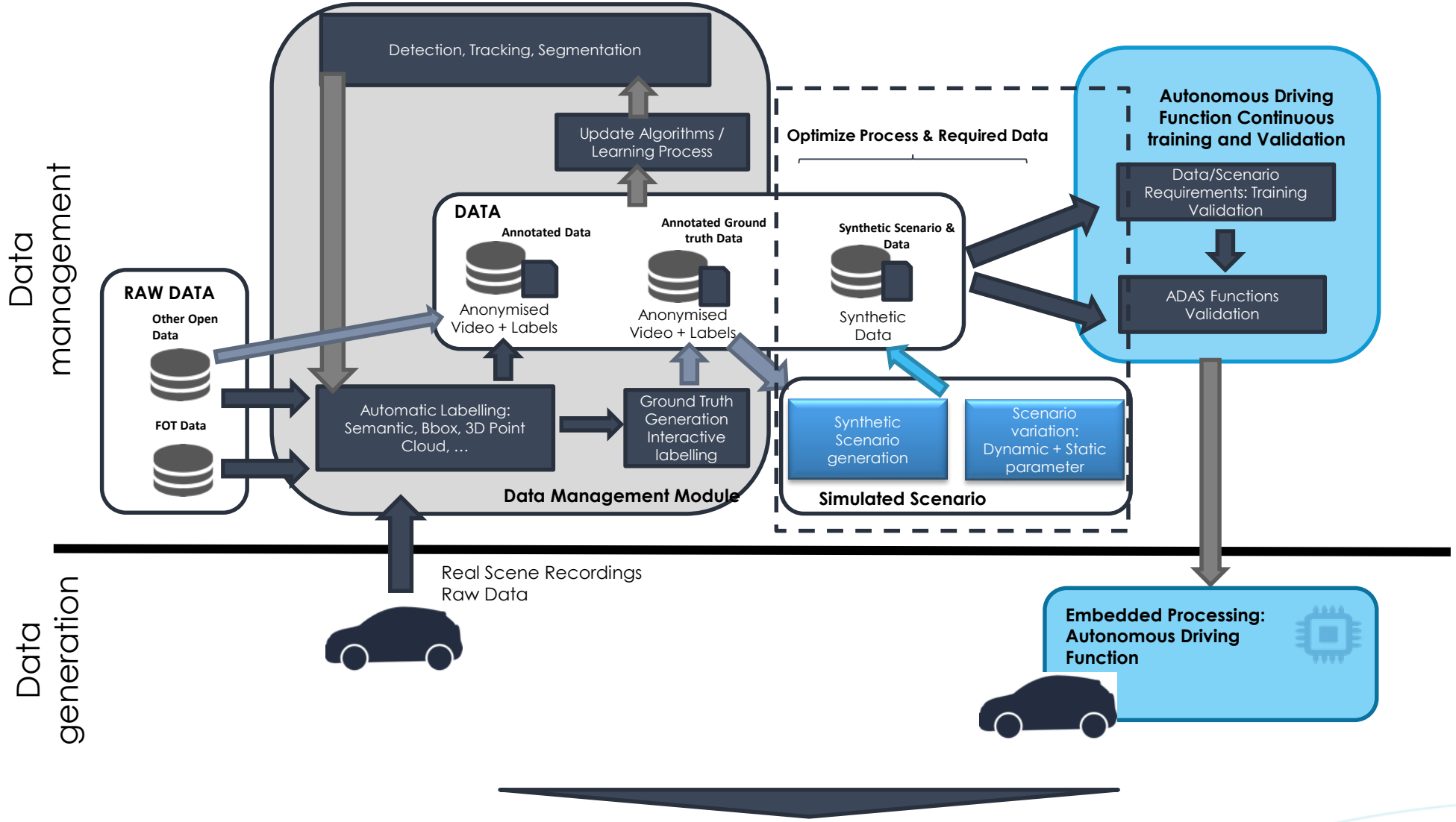
Context

Cloud-LSVA will create **Big Data technologies** to address the open problem of a lack of software tools, and hardware platforms, to **annotate very large-scale** datasets in the context of **ADAS** and **Digital Cartography to:**

- **Create large training datasets** of visual samples for training models using supervised learning to be used in vision-based detection.
- **Generate ground truth scene descriptions** based on objects (spatio-temporal) and events (temporal logic actions) to evaluate the performance of algorithms and systems that aim to detect or provide such descriptions.

HEADSTART will define **testing and validation procedures** of CAD functions including its key enabling technologies (i.e. communication, cyber-security, positioning) by cross-linking of all test instances such as **simulation**, **proving ground** and **real world field tests** to validate safety and security performance according to the needs of key user groups (technology developers, consumer testing and type approval).





DATA MANAGEMENT & TREACEABILITY

Recordings Raw data

LabelsVCD

Scenario Description

Vehicles & Sensors Prototypes

Test Data

Simulation Interface

OSI

Open Simulation Interface

- Generic interface between automated driving functions, driving simulation frameworks and sensor models

Static Data (Infrastructure)

OpenDRIVE

Road Network:

- Macroscopic Information
- Network, junctions, signals

OpenCGR

Road Surface:

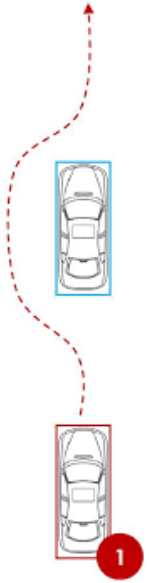
- Microscopic information
- Data format

Dynamic Data (manoeuvres)

OpenSCENARIO

Manouvers:

- Dynamic content
- Relations 6 scene descriptions



BASQUE RESEARCH & TECHNOLOGY ALLIANCE

graphicsvision.ai

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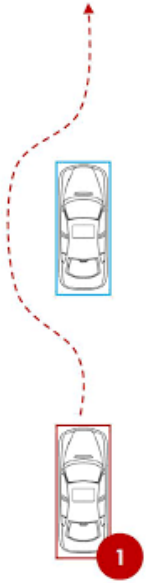

Real data (framewise element description)

OpenLABEL

Labels for sensor recordings:
- Required Annotations
- Data Type

Data Recordings (platform)

Recording platform:
- Format
- Synchronisation
- Calibration

No Standard

Simulation Interface

OSI

Open Simulation Interface
- Generic interface between automated driving functions, driving simulation frameworks and sensor models

Concept description

OpenOntology

Semantic description
- Semantic Concepts
- Taxonomy
- Relations and events defeinition
- Reasoning capacity

Concept Treaceability & interoperability

Static Data (Infrastructure)

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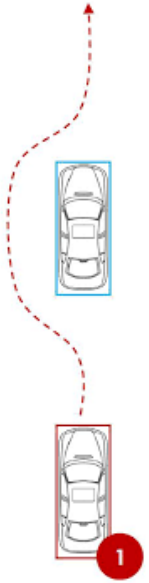

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OSL

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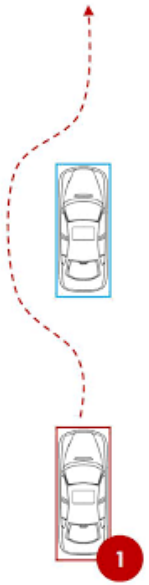


Real data (framewise element description)

VCD

Data Recordings (platform)

Recording platform:
- Format
- Synchronisation
- Calibration

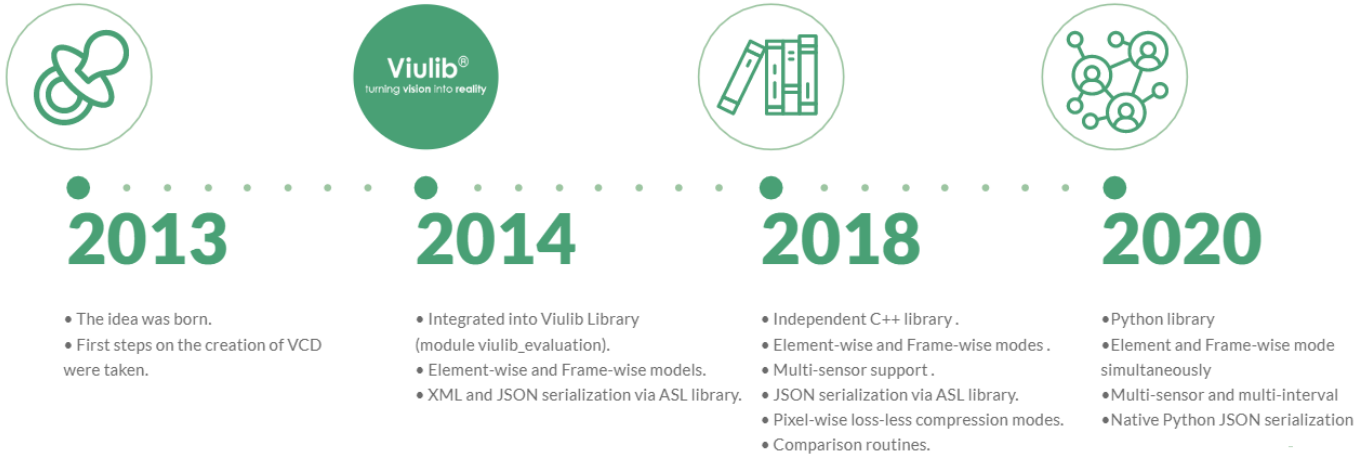
Labelling format

VCD - Video Content Description

VCD Video Content Description

- **Description:** syntax and tools for multi-purpose data labelling

- **Versions**
  - **VCD 1.0** – 2013
  - **VCD 2.0** – 2014
  - **VCD 3.0** – 2018
  - **VCD 4.0** – 2020



- **Used by**
  - **Internal developments** at Vicomtech
  - **European Projects** H2020
  - Industrial projects with Vicomtech's **costumers**

AUTOPILOT
CloudLSVA Large Scale Video Analysis
Viulib® turning vision into reality
EWISA
SmaCS
HEADSTART
VI-DAS
P-REACT
begirale
inLane Lane Navigation Technology
graphicsmedia.net

VCD Video Content Description

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VCD syntax

- Definition of **Elements**
  - (Actions, Events, Objects, Contexts, Relations)
- **Metadata** structures
- **Frame-wise** & Element-wise
- **Object data** primitives
  - name, type, uids
- Links to **ontologies**

Documentation
Schemas (JSON, Proto, TS)

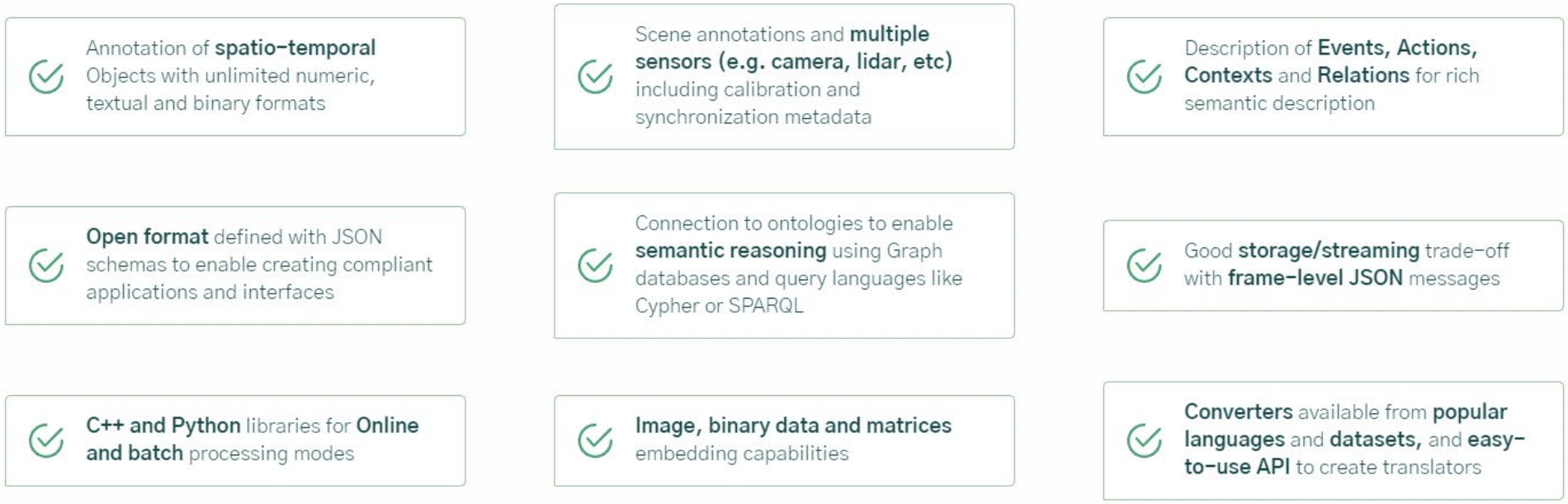
VCD libraries

- Create and **manage** VCD content within apps
- **Search** and process metadata
- Load/Save **files**
- **Converters** from other formats

SW libraries
C++, Python

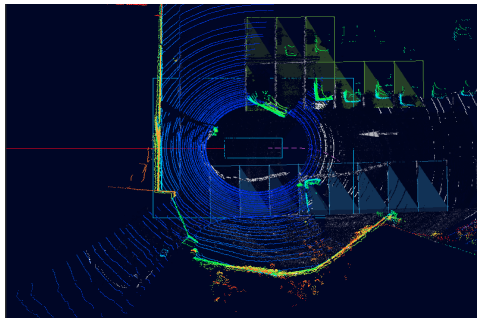
VCD Video Content Description

- **Features**
  - VCD's structure hosts **Objects, Actions, Events, Contexts, Relations** defined for **multiple-streams**, at multiple **frame-intervals**, at frame-level or static-level, and **serializable** for storage and communications

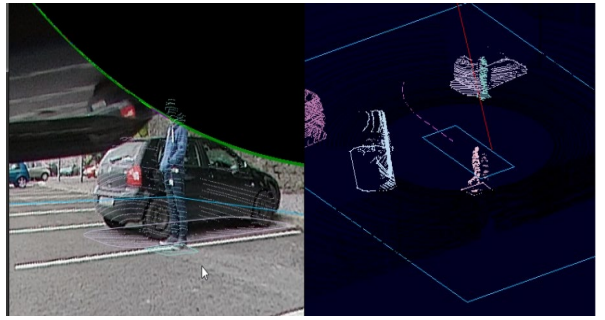


VCD Video Content Description

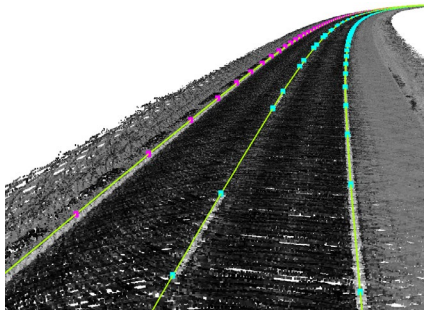
- **Metadata** which describe the content of a **scene** in an structured manner
- In many cases, **metadata needs to be attached to data series:** videos, lidar, static images, etc.
- **Annotations** need to cover:
  - Object descriptions
  - Spatio-temporal entities
  - Synchronization and timestamps
  - Sensor calibration
  - Numerical ranges
  - Actions and events
  - Time intervals
  - Relations between elements
  - Semantic concepts



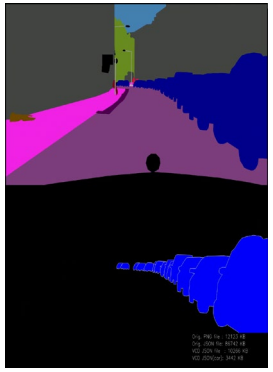
3D Parking slots



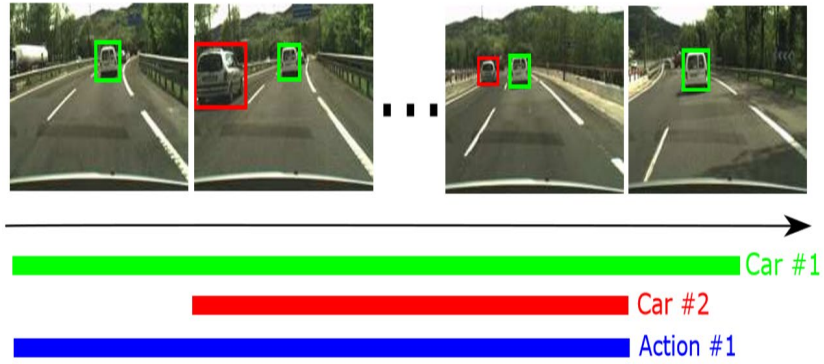
3D objects



3D lane markings



2D-3D objects 2D segmentation



Maneouvres (actions)

VCD Video Content Description

- **VCD structure**
  - **Elements**
    - containers of description of the scene
  - **Streams**
    - description of data sequences/measurements/observations of the scene
  - **Frames**
    - time-wise samples containing elements and streams information

VCD Video Content Description

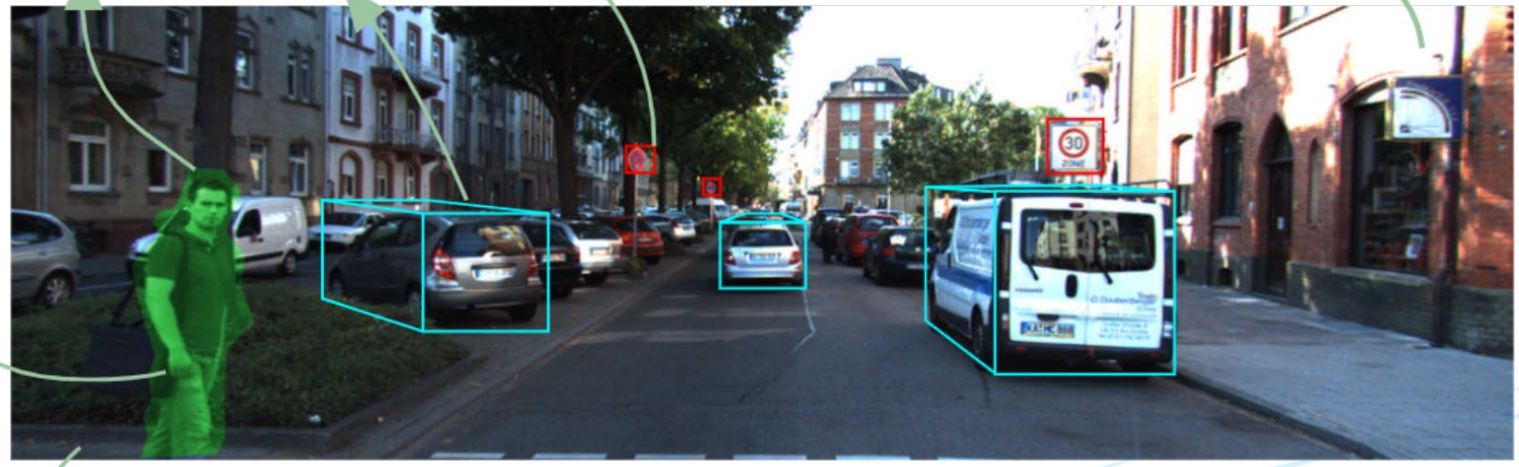
- **Elements** = {Objects, Actions, Events, Contexts, Relations}

Object

Person, signal, car or any object with spatial description (e.g. bounding box) and sensor ID from which it is seen

Context

This is an urban scene, it is sunny it is a sequence from an onboard camera



Action

The period of time where an action happens: looking at ego-vehicle crossing

Event

The moment in which the person starts crossing the road

Relation

The object person is the actor of the action, and the event triggers the action.
A person crosses the road when is sunny

VCD Video Content Description

- **Elements** = {**Objects**, **Actions**, **Events**, **Contexts**, **Relations**}

  Objects, and **Contexts** can be static (no time-information)

  e.g.: (pseudo-code expressions)

  Object "Mike" is a "Person"
  Mike's age is 38
  Mike's address is "Calle Mayor 12, Madrid"

  Object "TrafficSign1" is a "TrafficSign"
  TrafficSign1's position is (43.302276, -2.002997)
  TrafficSign1's class is "Stop"
  TrafficSign1's visibility is "Poor"
  TrafficSign1's position's labeled by "Annotator1"
  TrafficSign1's position's interpolated is "True"

  Context "Weather" is "Sunny"
  Context "Road" is "Urban"
  …

Static attributes

Nested attributes

VCD Video Content Description

- **Elements** = {**Objects**, **Actions**, **Events**, **Contexts**, **Relations**}

  Objects, **Actions**, **Events**, **Contexts** can be dynamic (defined with time information)

  e.g.:
  Mike's position is (2.6, 5.3, 0.0) at frame = 14
  Mike's position's reference is "ISO8855, rear-axle"
  Mike's speed is (2.5) at frame = 14
  …
  Mike's position is (2.5, 5.2, 0.0) at frame = 15
  …

  Action "MikeCrossing" is a "Crossing"
  Crossing1 happens during frames (15, 270)
  Action "MikeLooking" is a "Looking"
  MikeLooking happens during frames [(50, 200), (210, 250)]

  Event "MikeStartsCrossing" is a "StartCrossing"
  MikeStartsCrossing happens at frame (14)
  …

  Relation "r1" means "Mike" "isActorOf" "MikeCrossing"
  Relation "r2" means "Mike" "isNear" "TrafficSign1"
  …

Dynamic attributes

Frame intervals

Semantic relations

VCD Video Content Description

- **Streams**
  - Metadata: sensor type, properties, calibration, etc.
  - E.g. “front-camera”, “rear-camera”, “top-lidar”, “left-lidar”, etc.
  - Elements can be defined at Stream level
    - E.g. Other vehicle’s is at bbox (125, 54, 66, 50) **for Stream “front-camera” at frame = 0**
    - E.g. Other vehicle’s is at cuboid (4.60, 12.01, …) **for Stream “top-lidar” at frame = 0**
    - …

- **Frames**
  - VCD Master frame sequence [0, N]
  - Frames { “0”: {…}, “1”: {…}, … }
  - Stream properties
    - “front-camera”’s **frame idx = 2** at (master) frame = 0
    - “rear-camera”’s **frame idx = 2** at (master) frame = 1
    - “front-camera”’s **frame idx = 3** at (master) frame = 0
    - …
    - “front-camera”’s **timestamp = “2007-11-03T13:18:05.000” at (master) frame = 52**

Inter-stream frame-sync

Inter-stream timestamping

VCD Video Content Description

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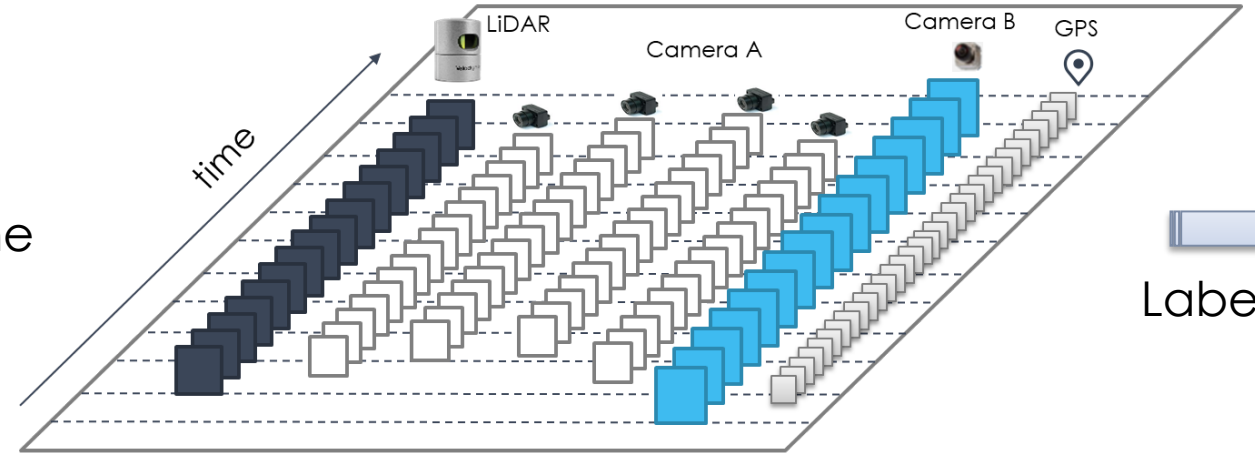
Batch / Offline

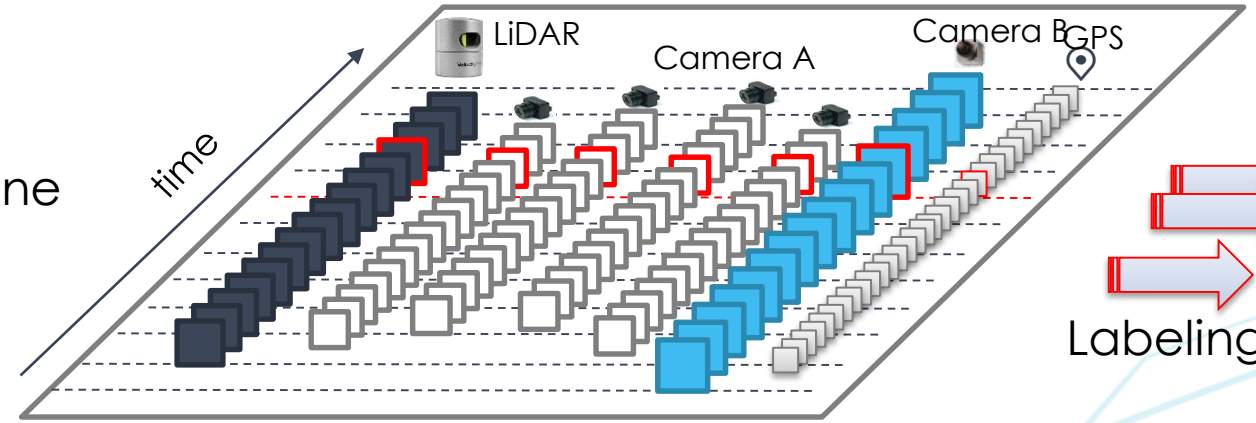


Recording - Data

Labeling

VCD file
-To be stored for archive/processing

Frames / Online



Life/Stream data

Labeling

VCD messages
-To be sent via comms

graphicsmedia.net

VCD Video Content Description

- **VCD defined with structured schemas**
  - JSON schema
  - From JSON Schema to other formats
    - Google Protobuf
    - TypeScript
  - Formal description of structure
  - Validates content
  - Version control (current v4.0.0)

vcd_schema_json-v4.0.0.json

```
{
    "$schema": "http://json-schema.org/draft-07/schema#",
    "additionalProperties": false,
    "definitions": {
        "action": {
            "additionalProperties": false,
            "properties": {
                "frame_intervals": {
                    "item": {
                        "$ref": "#/definitions/frame_interval"
                    },
                    "type": "array"
                },
                "name": {
                    "type": "string"
                },
                "ontology_uid": {
                    "type": "integer"
                },
                "stream": {
                    "type": "string"
                },
                "type": {
                    "type": "string"
                }
            },
            "required": [
                "name",
                "type"
            ],
            "type": "object"
        },
        "area_reference": {
            "properties": {
                "additionalProperties": false,
                "attributes": {
                    "$ref": "#/definitions/attributes"
...
```

VCD Video Content Description

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Serializable JSON/Proto

Object "Mike" is a "Person"
Mike's age is 38
Mike's address is "Calle Mayor 12, Madrid"

```
vcd = core.VCD()
uid = vcd.add_object("Mike", "Person")
vcd.add_object_data(uid, types.num("age", 38))
vcd.add_object_data(uid, types.text("address", "Calle Mayor
12, Madrid"))
```

Python VCD library

```
{"vcd": {"frames": {}, "version": "4.0.0", "frame_intervals":
[], "objects": {"0": {"name": "Mike", "type": "Person",
"frame_intervals": [], "object_data": {"num": [{"name": "age",
"val": 38}], "text": [{"name": "address", "val": "Calle Mayor
12, Madrid"}]}}}}}
```

263 bytes

Pretty

```
{
    "vcd": {
        "frame_intervals": [],
        "frames": {},
        "objects": {
            "0": {
                "frame_intervals": [],
                "name": "Mike",
                "object_data": {
                    "num": [
                        {
                            "name": "age",
                            "val": 38
                        }
                    ],
                    "text": [
                        {
                            "name": "address",
                            "val": "Calle Mayor 12, Madrid"
                        }
                    ]
                },
                "type": "Person"
            }
        },
        "version": "4.0.0"
    }
}
```

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VCD Video Content Description

Serializable JSON/Proto

Object "TrafficSign1" is a "TrafficSign"
TrafficSign1's position is (43.302276, -2.002997)
TrafficSign1's class is "Stop"
TrafficSign1's visibility is "Poor"
TrafficSign1's position's labeled by "Annotator1"
TrafficSign1's position's interpolated is "True"

```
vcd = core.VCD()
uid = vcd.add_object("TrafficSign1", "TrafficSign")
position = types.vec("position", (43.302276, -2.002997))
position.add_attribute(types.text("labeler", "Annotator1"))
position.add_attribute(types.boolean("interpolated", True))
vcd.add_object_data(uid, position)
```

Python VCD library

```
{"vcd": {"frames": {}, "version": "4.0.0", "frame_intervals":
[], "objects": {"0": {"name": "TrafficSign1", "type":
"TrafficSign", "frame_intervals": [], "object_data": {"vec":
[{"name": "position", "val": [43.302276, -2.002997],
"attributes": {"text": [{"name": "labeler", "val":
"Annotator1"}], "boolean": [{"name": "interpolated", "val":
true}]}}], "text": [{"name": "class", "val": "Stop"}, {"name":
"visibility", "val": "Poor"}]}}}}}
```

438 bytes

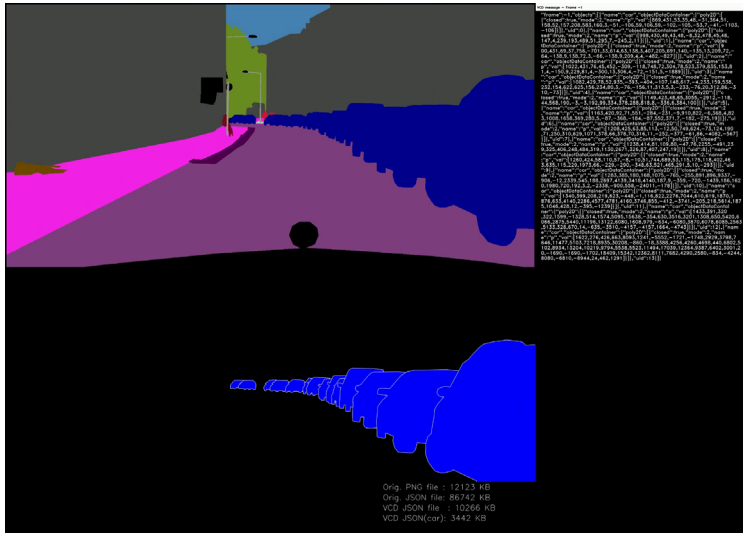
Pretty


```
{
    "vcd": {
        "frame_intervals": [],
        "frames": {},
        "objects": {
            "0": {
                "frame_intervals": [],
                "name": "TrafficSign1",
                "object_data": {
                    "text": [
                        {
                            "name": "class",
                            "val": "Stop"
                        },
                        {
                            "name": "visibility",
                            "val": "Poor"
                        }
                    ],
                    "vec": [
                        {
                            "attributes": {
                                "boolean": [
                                    {
                                        "name": "interpolated",
                                        "val": true
                                    }
                                ],
                                "text": [
                                    {
                                        "name": "labeler",
                                        "val": "Annotator1"
                                    }
                                ]
                            },
                            "name": "position",
                            "val": [
                                43.302276,
                                -2.002997
                            ]
                        }
                    ]
                },
                "type": "TrafficSign"
            }
        },
        "version": "4.0.0"
    }
}
```

VCD Video Content Description

Pixel-wise / Semantic segmentation

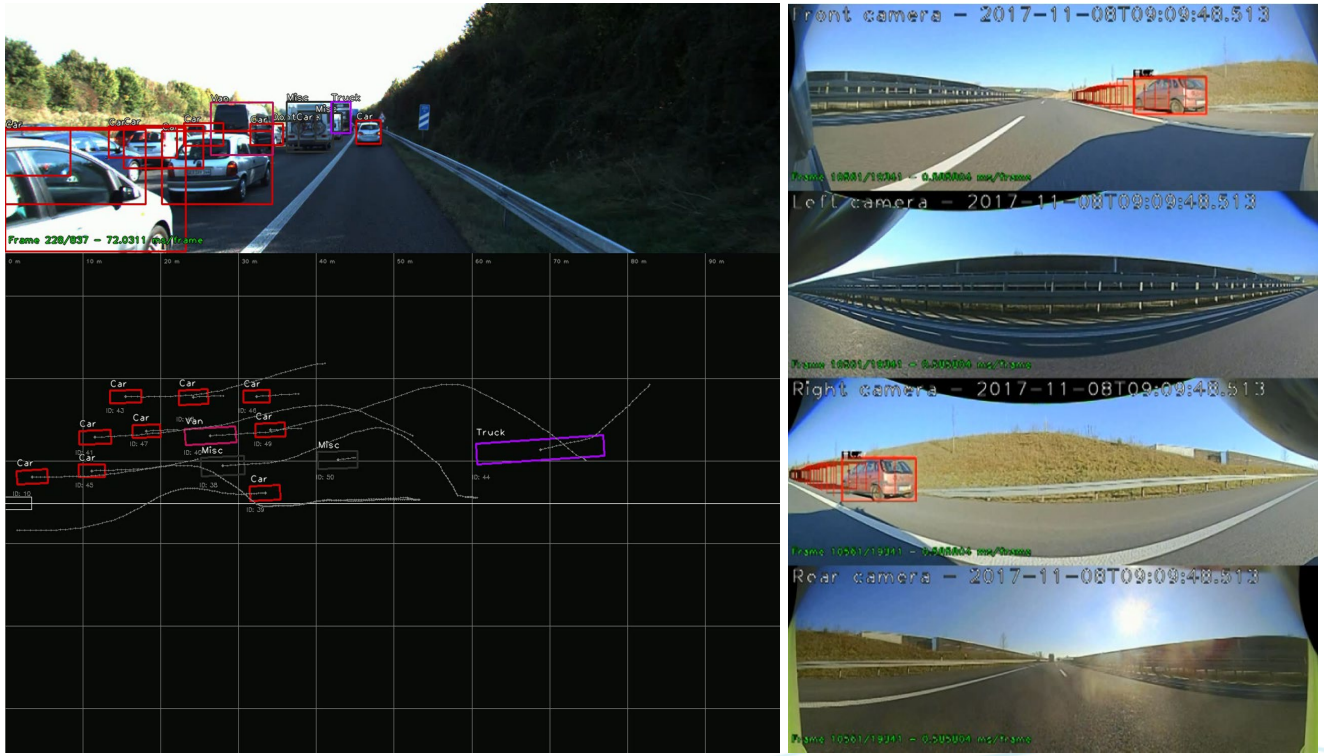
- **Huge datasets** (Mapillary, KITTI) for machine learning training
  - Data: Original HR images
  - Labels: PNG images, each pixel with a code color representing a class, and an instance
- VCD allows representing **these PNG labels** as polygons or
  - Accessing specific classes, no need to have image readers each time
  - Compression: polygonization techniques can be applied
- VCD can describe **class**, **instances**, and **holes**
- **VCD Python library has lossless polygon compression**



VCD Video Content Description

Multi-sensor annotation

- **Same real object**
- Described as a single
  - Inside, each representation of the Object for each view/stream
- Useful if data is annotated in several steps
  - Video first
  - Then LIDAR
  - Or different annotators/detectors
- **Annotations can be added** seamlessly to the VCD
- **Timestamping** and synchronization is added to guarantee alignment with data



VCD Video Content Description

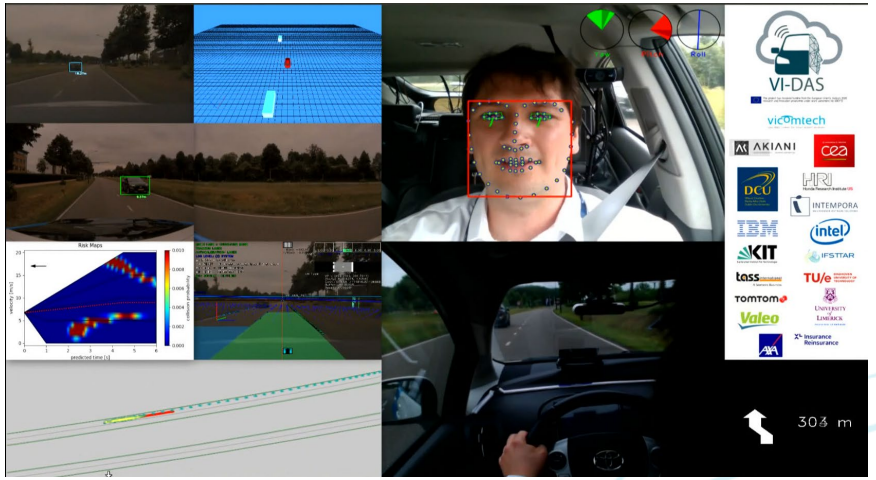
Useful Object primitives

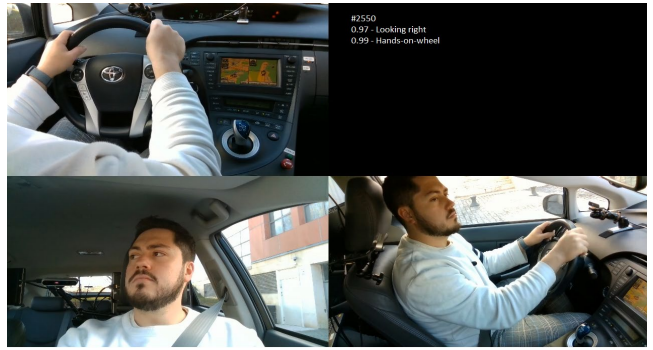
- **ObjectData**
  - bbox
  - poly2d
  - poly3d
  - image
  - binary
  - mat
  - num
  - vec
  - text
  - boolean
  - mesh
  - line_reference
  - area_reference

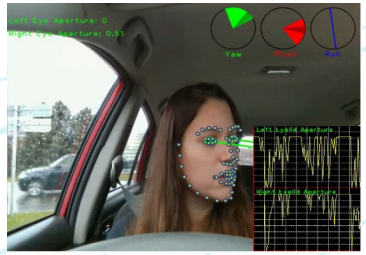
- Nested ObjectData (**attributes**) to describe any complex structure

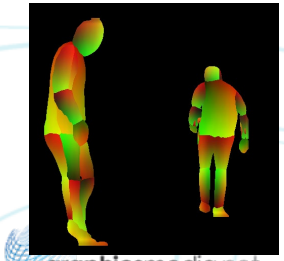
Additional example use cases

- Lanes as 3D polylines with text attributes
- Parking slots as meshes of points, lines and areas, with attributes
- Lateral position within ego-lane as vec
- Eye blinks, head pose and gaze vectors of driver
- Skeleton and human-pose
- …









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OSL Ontology-based Semantic Labelling

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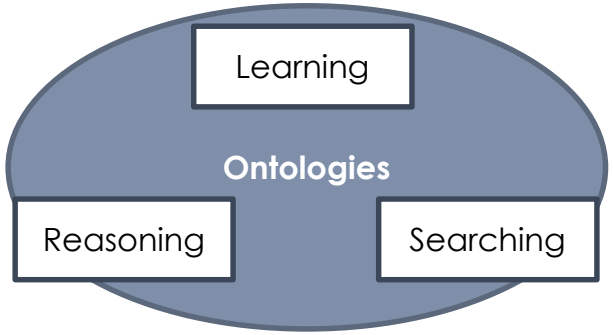
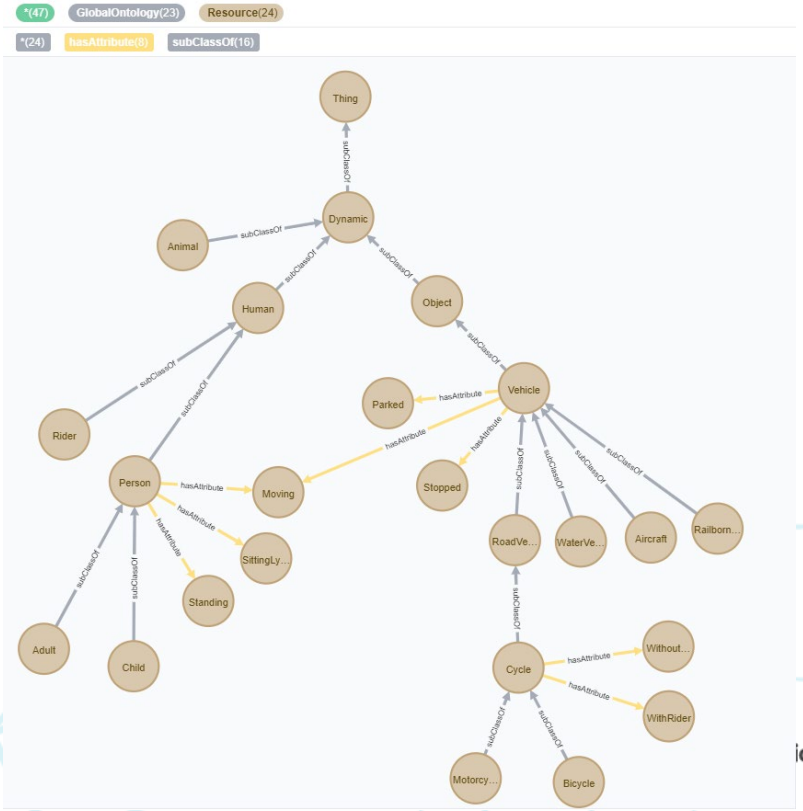
Semantic labelling - Ontologies

- Semantics provide meaning to data
  - Learning
  - Reasoning
  - Searching

- Ontologies
  - Classes
  - Properties
  - Relations





- Ontologies to host knowledge, establish rules, enable translation, advanced querying

- Labelled data using classes, properties and relations from Ontologies
  - Enable dataset fusion, translation
  - Guarantees compatibility with future extensions, adding detail
  - Advanced querying

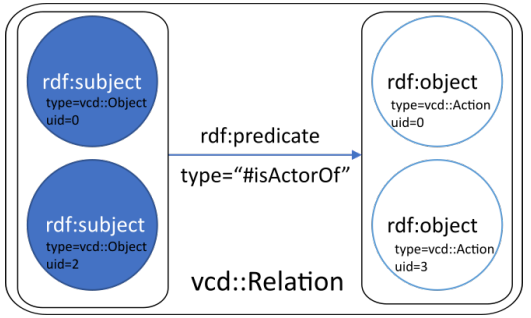
Ontology
.owl

OSL Ontology-based Semantic Labelling

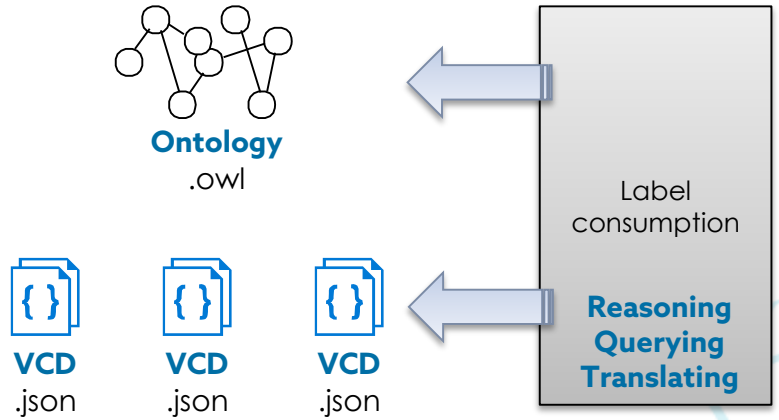
Semantic labelling - Labels

- Element's types can refer to a Class in an ontology
  e.g. **Object** "Mike" is a "#Person" as defined in https://vcd.vicomtech.org/ontologies/automotive

- **Relations** can define relationships between elements, defined as ontology classes
  Relations are defined as **RDF triplets**
  e.g. **Relation** "r1" means "Mike" "#isActorOf" "MikeCrossing"

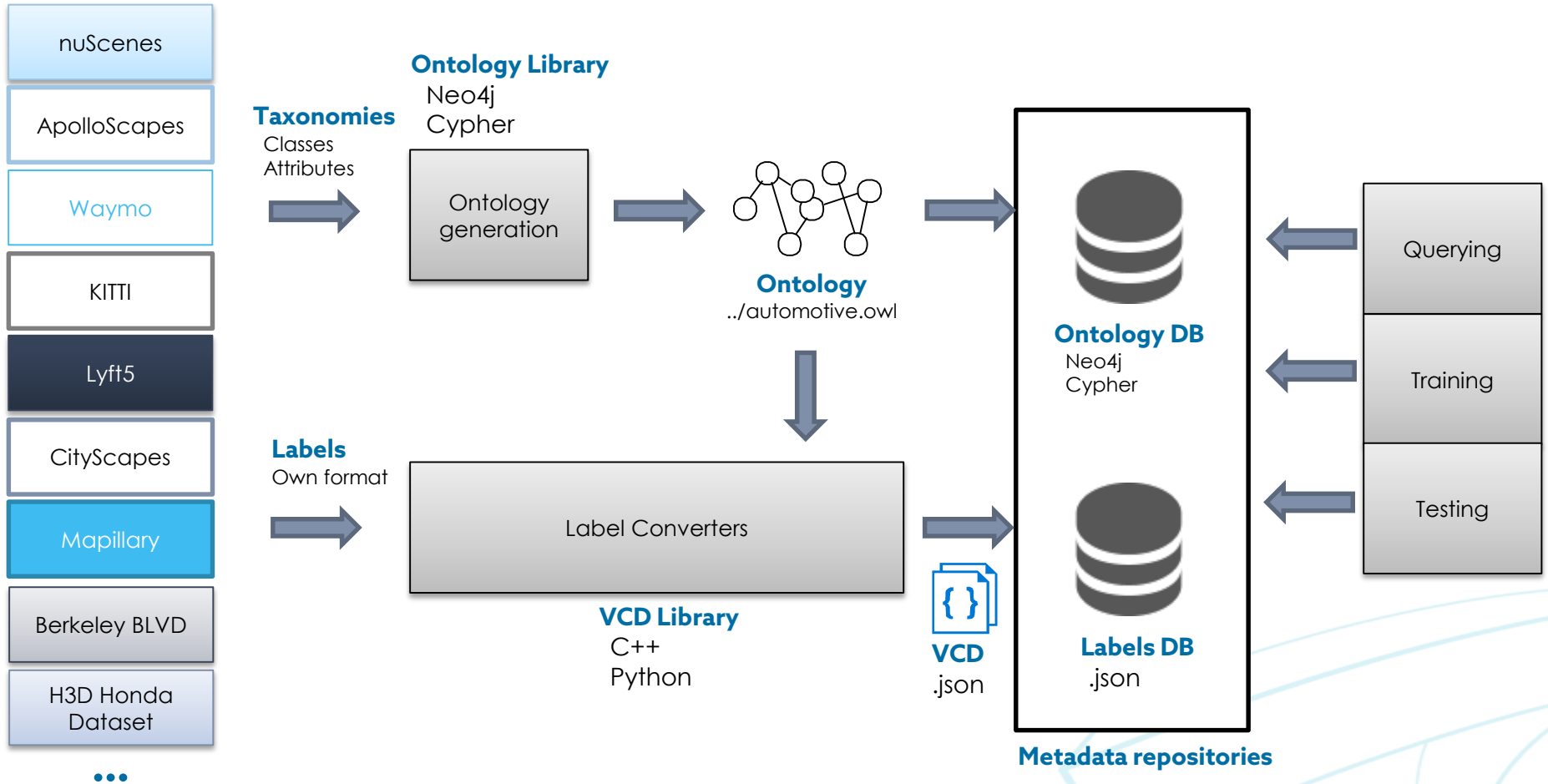


- Ontology-related keywords
  - **Class hierarchies ("isA")**: Pedestrian "isA" Person, SUV "isA" Vehicle
  - **Similarity/Translation links ("sameAs")**: Pedestrian "sameAs" Fußgänger
  - **Possible attributes ("hasAttribute")**: Pedestrian "hasAttribute" moving
  - …



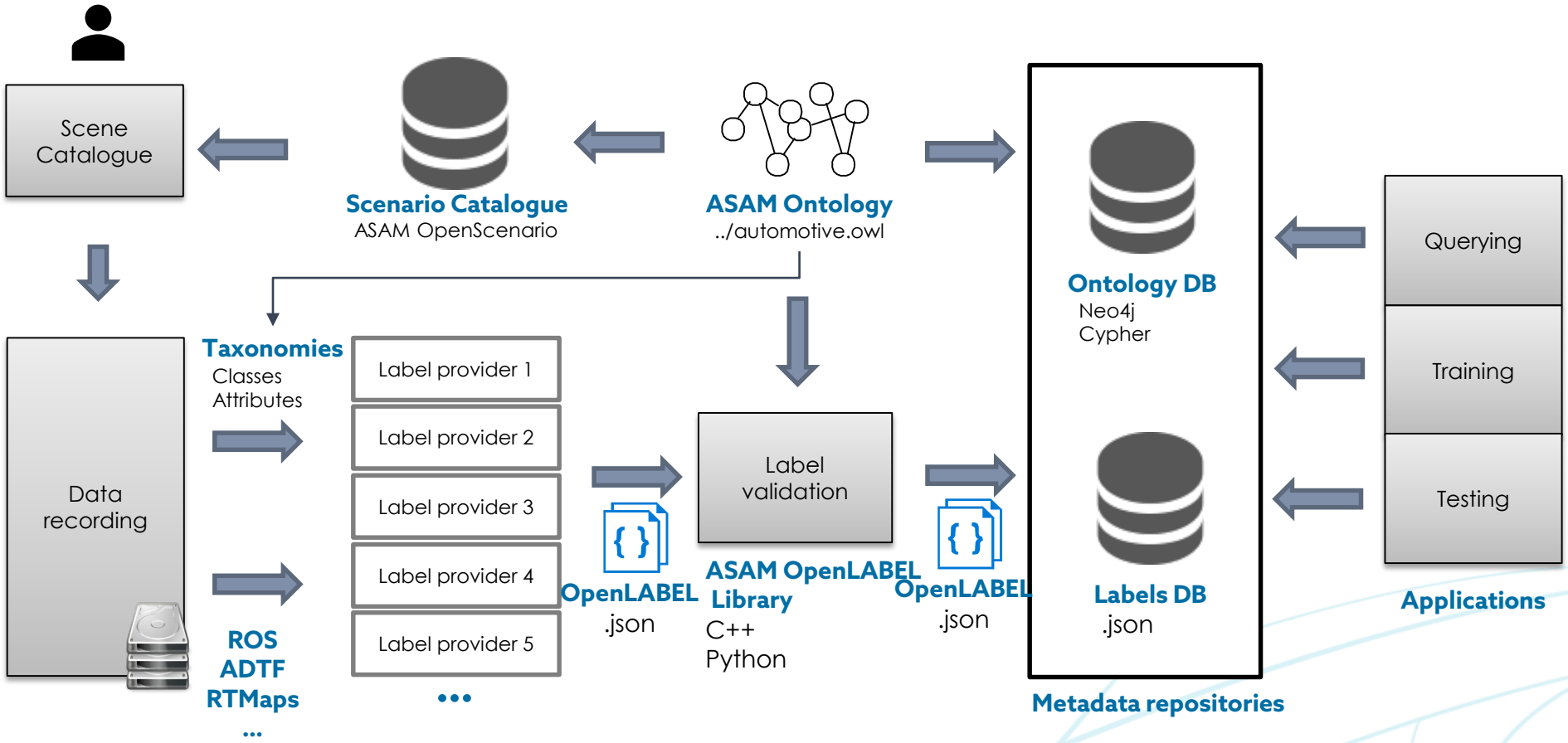
OSL Ontology-based Semantic Labelling

Semantic labelling – Creating the standard



OSL Ontology-based Semantic Labelling

Semantic labelling – Using the standard

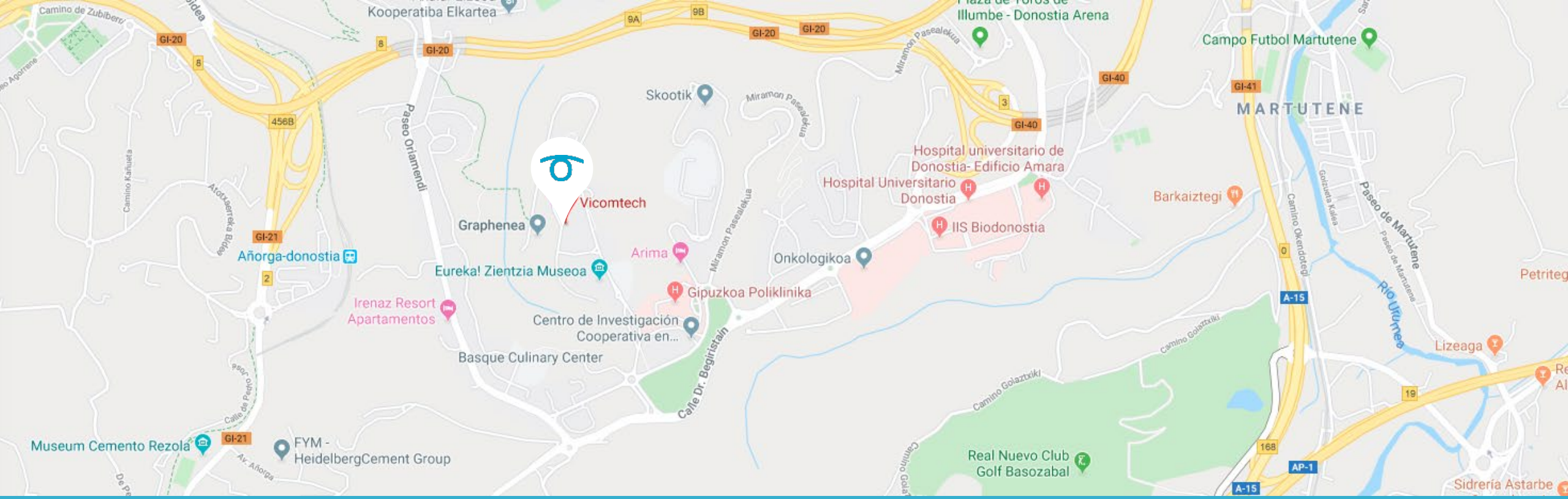


Next steps

- **Provide documentation about** VCD 4.0.0 schema and VCD 4.0.0 Python library
- **Consolidate OSL Ontology** from major datasets
- **Open github** repositories and publish current developments

- Study **OpenLABEL requirements** and participate in **definition of standard**
- Analyze co-existence of other related languages and standard initiatives (**OSI, OpenScenario, OpenDrive**)

- **Create tools and applications**
- **Open to develop reference implementation of standards**



Eskerrik asko
Gracias
Thank You

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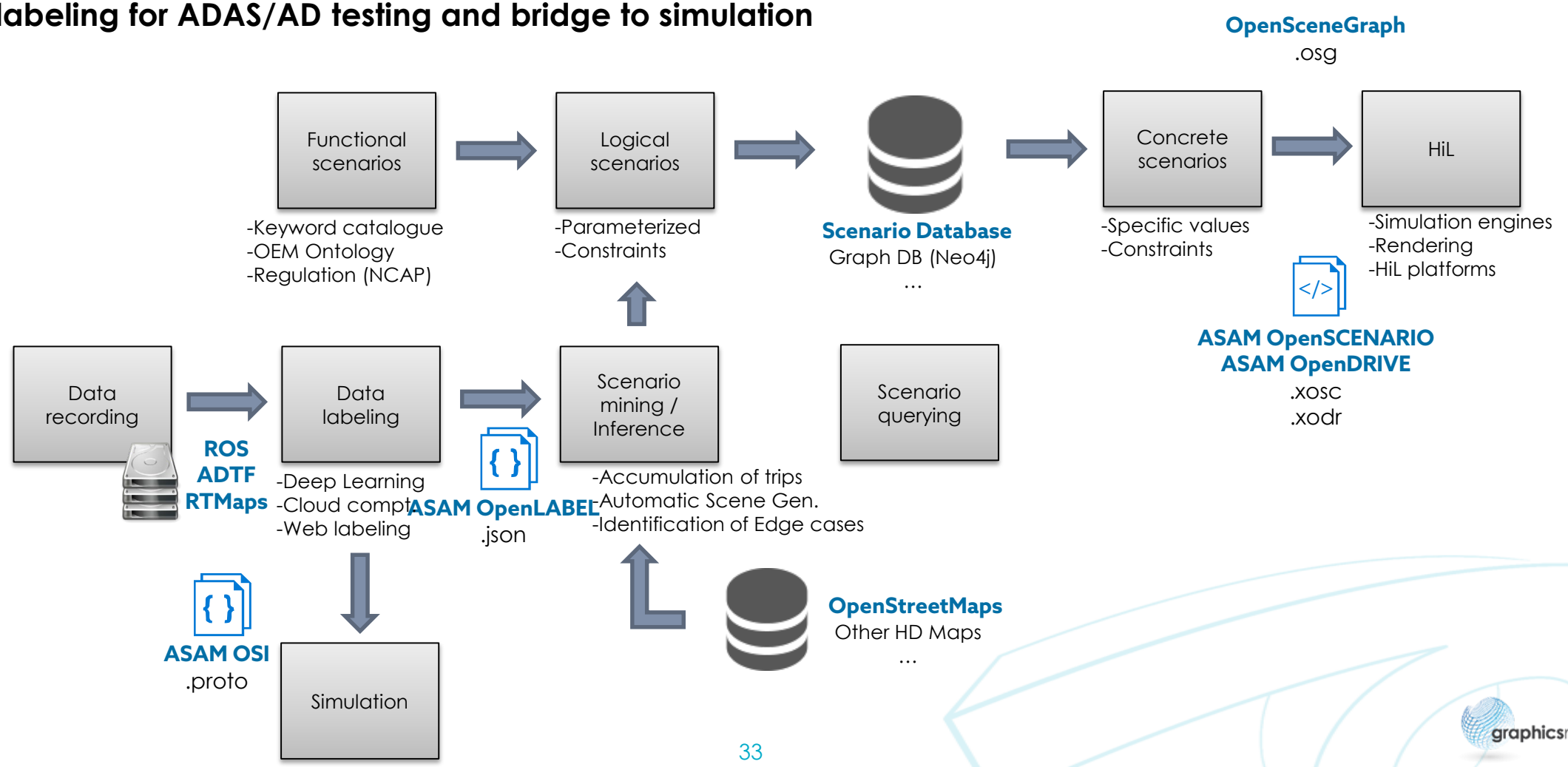
OSL Ontology-based Semantic Labelling

vicomtech

Data labeling for ADAS/AD testing and bridge to simulation



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