

## **ETA: Extensible Toolkit for Video Analytics**

**PSCR Public Safety Broadband Stakeholder Meeting** 

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**Posted with permission** 

# How do we get from here

- 1

SEAGAT

vehicle density: light road: urban scene: four way intersec

SEAGATE

# And from here

37

van GMC

VEHICLE

VEHICLE 35 suy, yellow

SIGN

e way VEHICLE sedan, black

38

00:00:00

# To here?

### By creating an

open-platform for

video analytics

## **NIST Grant: The ETA Project**

The Extensible Toolkit for Analytics (ETA) is our open-source library for video analytics.

#### **Our Technical Goal**

• Establish an extensible video analytics infrastructure that will support next-generation capabilities in public safety applications.

#### **Our Programmatic Goal**

• Catalyze a community of innovation that brings public safety video analytics up-to-date with cutting edge computer vision research.



## What is Hard About This?

- How to leverage the state of the art in computer vision and machine learning?
- How to spread these capabilities to broad uses in public safety?
- How to **integrate** with existing and proprietary stacks?
- How to scale?
- How to incentivize stakeholders?



## **Video-First Analytics**

Standard Approaches are Frame-Based

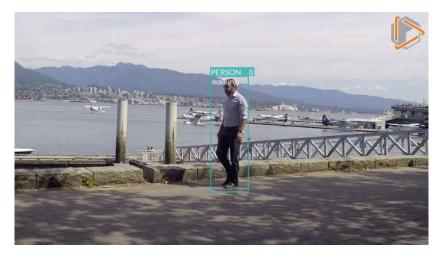






#### Running? Walking? Standing?

#### Voxel51 is Video First



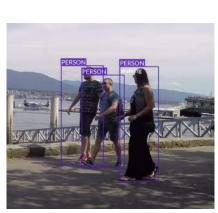
Walking!



## **Video-First Analytics**

Standard Approaches are Frame-Based





#### Standing? Walking?

Voxel51 is Video First



Walking!

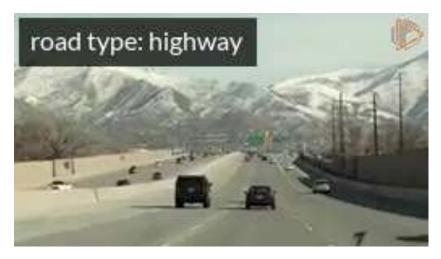


## **Video-First Analytics**

Standard Approaches are Frame-Based



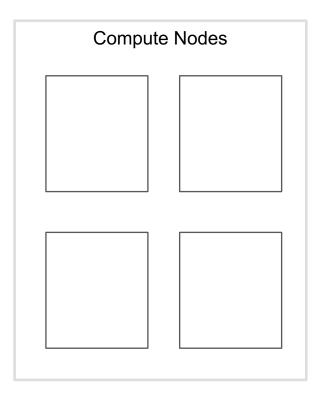
#### Voxel51 is Video First

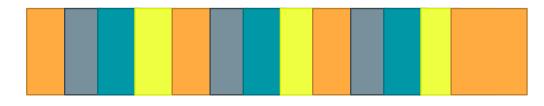


12.8% improvement



### **Streaming Analytics**





Time \_\_\_\_\_



## **Extensible Analytics**

- Platform-SDK
  - Enables third-party party analytic developers to easily deploy and integrate their analytics on our platform.
  - Directly integrates into the overall ETA infrastructure.
- Available on GitHub

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## **Example Third-Party: Privacy-Preserving Analytic**

• Handle FOIA requests with automated ease.

Original



**Anonymized Faces** 





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### VehicleSense: fine-grained vehicle recognition

VEHICLE 9 VEHICLE 34 - 29 VEHICLE 9 VEHICLE 31 black, infiniti, rear driver side, crossov White, mercedes, v White toyota rear, sedan

https://voxel51.com/senses/vehicle-sense

road: urban scene: complex inters RoadSense: adds road signs and road scenes vehicle density: heavy

VEH

1.1.1.1.1.1.1.1.1.1

https://voxel51.com/senses/road-sense

ellow toyota, min

toyce a see a sedan



Prediction: Explosion

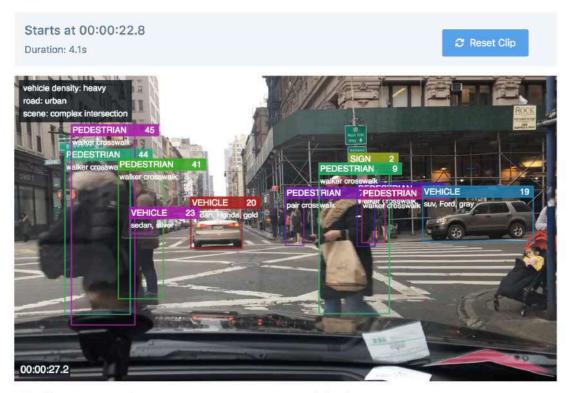




Ground Truth: theft Prediction: theft



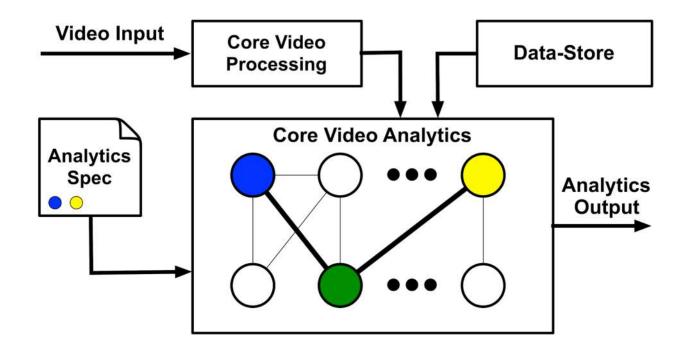
#### Video 20ddf373



Added by: support@voxel51.com Key: 20ddf373 Recorded: Unknown Uploaded: 2019-01-07T20:59:43



### **ETA System Design**





## **ETA System I/O**

#### Video Input

• Users connect data asynchronously to the Voxel51 Platform

#### **Data-Store**

- Stores user-uploaded data, internal metadata, models, parameter files, and analytics outputs
- Storage is implemented as a collection of scalable buckets in **Google Cloud** or **AWS**

#### **Analytics Output**

- Returned in a simple, flexible JSON format
- Users can download analytics asynchronously from the Voxel51 Platform



## **ETA System Analytics**

#### **Core Video Processing**

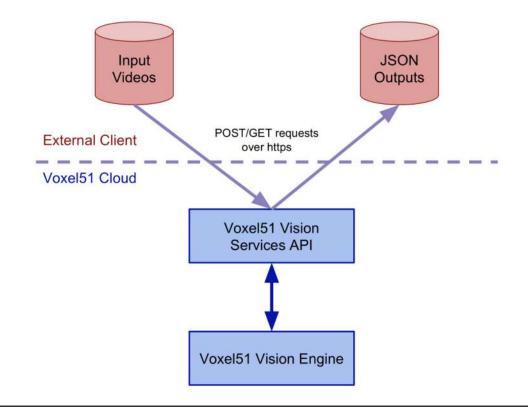
- Low-level video operations such as sampling, resizing, optical flow, and segmentation
- Preprocessing step for all input video
- Generates an internal representation of the video that is amenable for subsequent analysis

#### **Core Video Analytics**

- Implements **core computer vision analytics** such as detection, tracking, classification, and recognition
- Relies heavily on open-source libraries (OpenCV, TensorFlow, Keras, etc.) and publicly available research implementations of modern vision algorithms

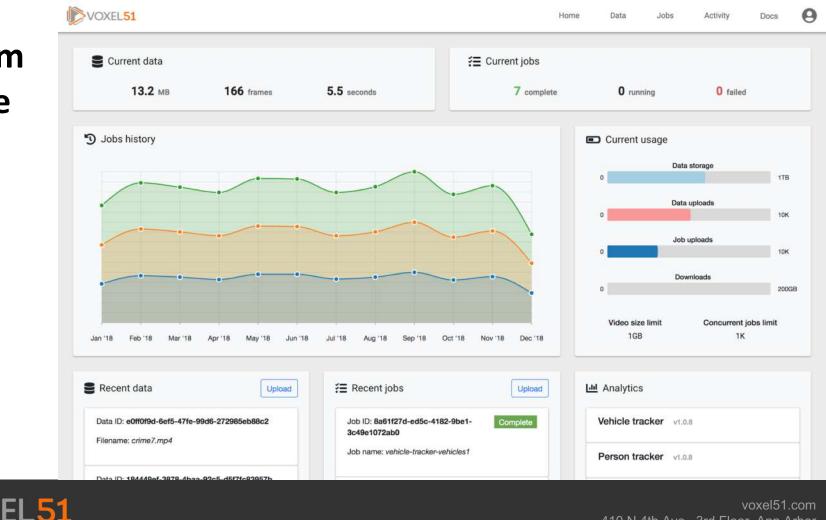


### **API Design**





## **Platform** Console



## Platform Console

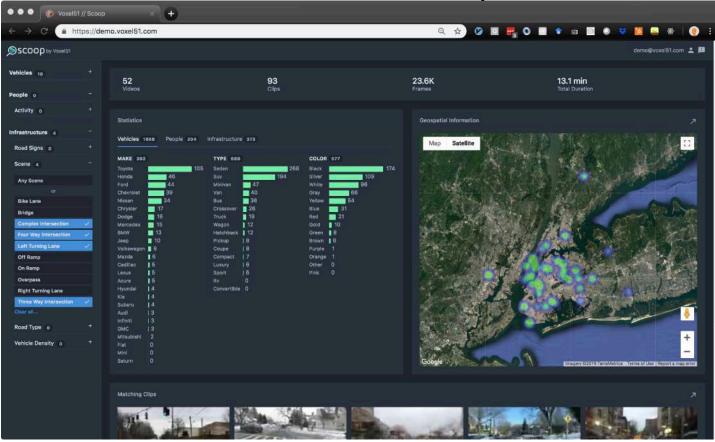
Jobs Board

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### Scoop pulls this all together

#### https://voxel51.com/demo



## **Faceted Search**

- Direct access to ontology
  - Search meaningful
  - Create complex logical queries
- Labels schema
  - Schema enforced by system
  - $\circ$  User-uploadable
  - Automatically generated (later)
- Backend builds an index of content and returns slice of dataset in real-time
- Let's you drill into specific concerns

Vehicles 0	
Туре о	+
Make o	+
Color o	+
People 0	
Activity o	+
Infrastructure 0	
Road Signs 0	+
Scene 0	+
Road Type o	+
Vehicle Density 0	+

<b>80</b> Videos	<b>80</b> Clip		96.9K Frames		<b>3.7 min</b> tal Duration
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Honda	208	Suv	771	Silver	421
Ford	172	Minivan	220	White	394
Nissan	128	Van	128	Gray	280
Chevrolet	116	Truck	119	Red	121
Dodge	58	Crossover	91	Blue	104
Chrysler	54	Hatchback	69	Yellow	98
Jeep	52	Bus	68	Gold	43
Hyundai	47	Pickup	60	Green	29
Volkswagon	46	Wagon	46	Brown	24
BMW	36	Compact	37	Purple	4
Mercedes	35	Coupe	32	Orange	3
Mazda	24	Sport	25	Other	0
Audi	21	Luxury	16	Pink	0
Lavrie		Convertible			



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## Insights

- Backend index provides facetedsearch results
- Summarized
  - Occurrence statistics across ontology
  - Co-occurrence statistics with facet
  - Spatial information
- All individual resources can be studied independently as well

Vehicles 0	
Type o	+
Make o	+
Color o	+
People 0	
Activity o	+
Infrastructure 0	
Road Signs 0	+
Scene 0	+
Road Type o	+
Vehicle Density 0	+

<b>80</b> Videos	<b>80</b> Clip		96.9K Frames		3.7 min Ital Duration
Statistics					
Statistics					
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Ford	172	Minivan	220	White	394
Nissan	128	Van	128	Gray	280
Chevrolet	116	Truck	119	Red	121
Dodge	58	Crossover	91	Blue	104
Chrysler	54	Hatchback	69	Yellow	98
Jeep	52	Bus	68	Gold	43
Hyundai	47	Pickup	60	Green	29
Volkswagon	46	Wagon	46	Brown	24
BMW	36	Compact	37	Purple	4
Mercedes	35	Coupe	32	Orange	3
Mazda	24	Sport	25	Other	0
Audi	21	Luxury	16	Pink	0



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## **Open-Source**

- ETA Vision Engine Code
- API-PY Python API Client Library
- API-JS Javascript API Client Lib.
- Platform-SDK Wrap your custom vision methods to be deployed on the platform at scale.
- Coming Soon!
  - Player51 State of the art Javascript video player
- All at https://github.com/voxel51

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E README.md

#### **ETA: Extensible Toolkit for Analytics**

An open and extensible video analytics infrastructure.

This project is supported by the NIST Public Safety Innovation Accelerator Program.

## **Platform**

### Docs

<b>Q</b> Search
Analytics Documentati
video-formatter
vehicle-detector
vehicle-tracker
vehicle-indexer
person-detector
person-tracker
person-indexer
sign-tracker
Inputs
Parameters
Outputs
object-matcher

#### sign-tracker

A tool for tracking road signs in videos.

#### Inputs

Name	Туре	Description
video	Video	the input video

#### Parameters

Name	Туре	Description	Required	Default
fps	Number	a frame rate at which to process the video. By default, the frame rate of the input video is used	false	180
size	Array	an optional [width, height] to use when processing the video frames. Dimensions can be $\pm 1$ , in which case the input aspect ratio is preserved. By default, the resolution of the input video is used	false	-

Name	Туре	Description	Filename
signs	VideoLabels	a JSON file describing the tracked road signs	signs.json

#### object-matcher

A tool for finding best matches for a query image in an object corpus.

#### Inputs Type Description Name Image the input query image to use query ZippedVideoFileDirectory videos a zipped directory containing the video corpus ZippedDetectedObjectsSequenceDirectory a zip file containing directories of JSON files describing detected objects objects in each video

#### shell python javascript

#### Example Code

from voxel51.api import API from voxel51.jobs import JobRequest

input\_data = "/path/to/input/video.mp4" job\_output - "/path/for/signs.json"

api = API()

data api upload\_data(input\_data) data\_id = data["data\_id"]

job\_request = JobRequest("voxe151/sign-tracker") job\_request.set\_input("video", data\_id=data\_id) job\_request\_set\_parameter("fps", 15) = optional job api upload job request( job\_request, "sign-tracker-test", auto\_start=True, use\_gp job\_id = job["job\_id"]

api wait\_until\_job\_completes(job\_id) api download\_job\_output(job\_id, job\_output)

#### Example Code

from voxe151.api import API from voxel51.jobs import JobRequest

api = API()

- data1 = api upload\_data("/path/to/input/query.png")
- data2 = ap1 upload data("/path/to/input/videos.zip")
- data3 = api.upload\_data("/path/to/input/objects.zip")

data4 = api upload data(\*/path/to/input/features.zip\*)





# **Case Study: Mapping Smart Cities**

https://voxel51.com



Data: GPS Tagged Dashcam Video

Goal: Map all road signs in the city

### **Existing Frame-based Methods**

Many spurious detections

Unusable for mapping

**FRAFFICLIGH** 

## Voxel51 Video-Based Model

#### More accurate

#### **Enables mapping**

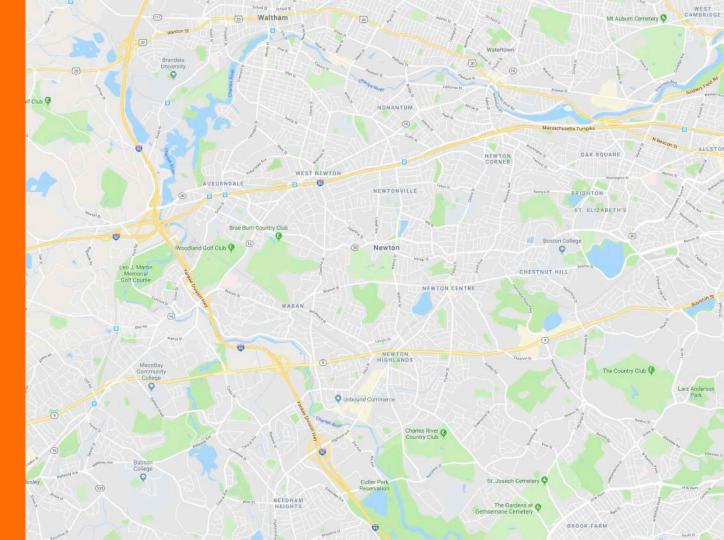
**TRAFFICLIGHT** 

### Newton, MA

2.6 Days of Video

Few Hundred Miles

10 Hours of Compute

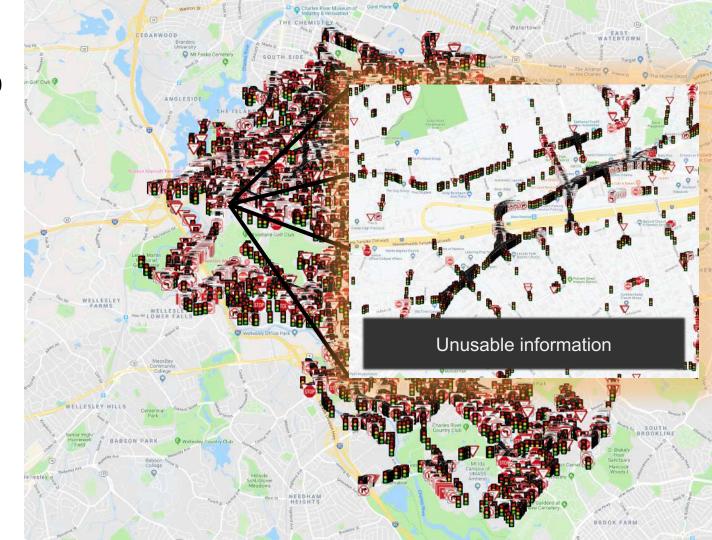


#### Frame-Based Models

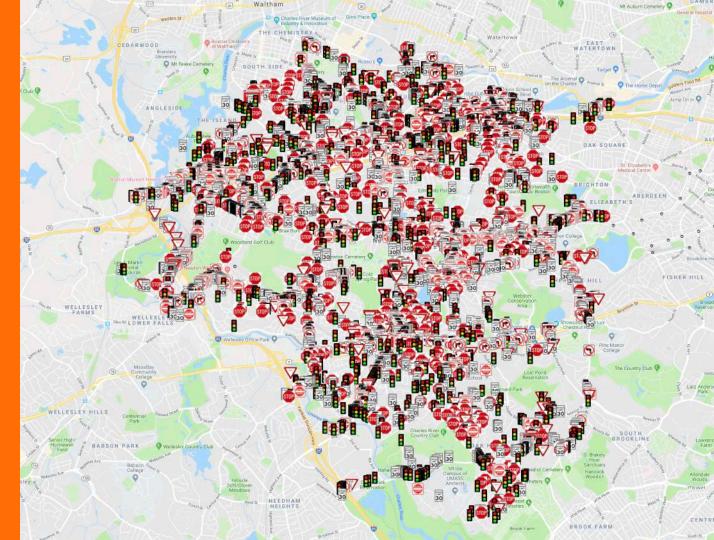
#### Voxel51 Video-Based Model



## Frame-Based Road Sign Map



# Voxel51 Road Sign Map



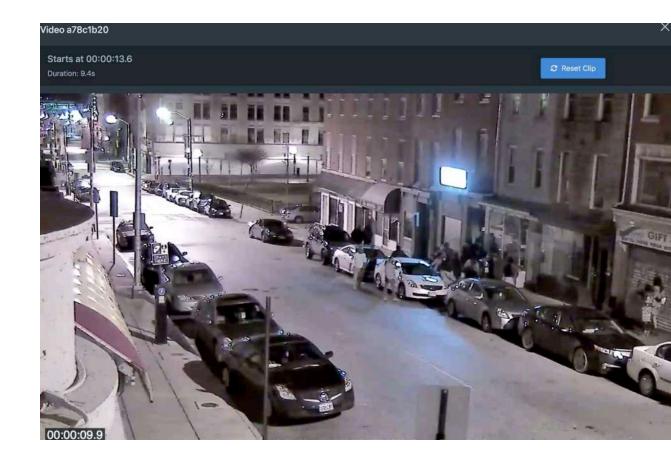


# Case Study Teaser: Baltimore CitiWatch

https://voxel51.com

### **Fight Detected**









solutions@voxel51.com https://voxel51.com/demo

# **#PSCR2019**

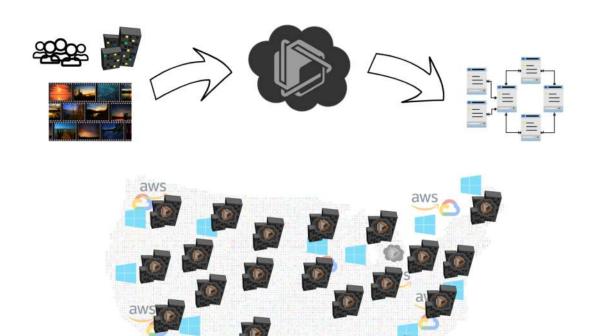
Come back for the **Next Session**2:25 PM

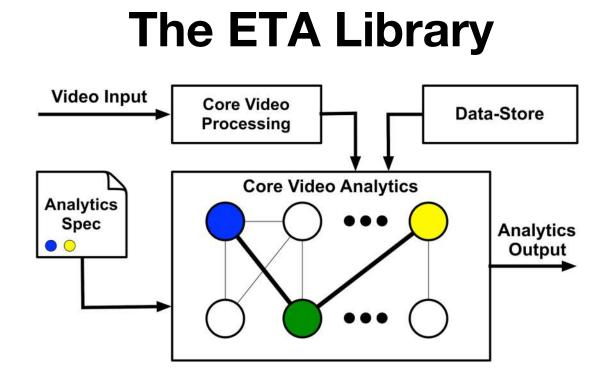
A ....



Backup

#### **Deployment Strategy**







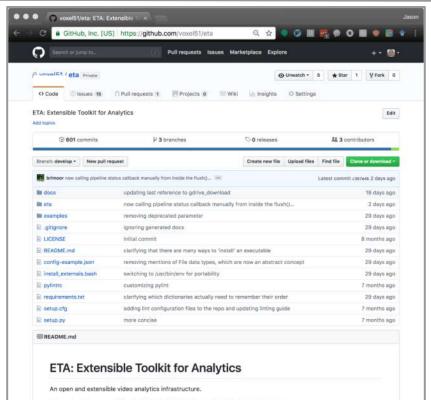
# **ETA Library**

- Modular software infrastructure
- Core infrastructure implemented in Python to maximize accessibility to the vision community
- Modules are generic and can be implemented in arbitrary languages (e.g. C++) and even hosted remotely in third-party clouds
- Modules are connected to form pipelines that are run to compute the requested analytics
- Analytics are stored in a simple, flexible **JSON format**

The ETA System is a dynamically configurable graph whose nodes are modules and whose edges represent data flowing through the system



#### **Open-Source on GitHub!**



This project is supported by the NIST Public Safety Innovation Accelerator Program.



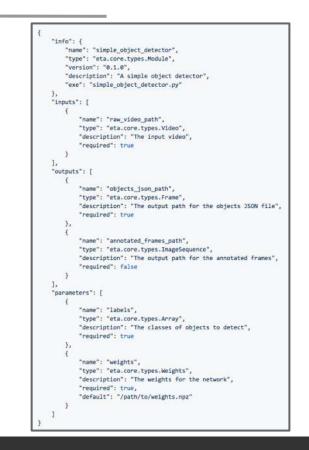
### **ETA Modules**

- ETA modules are simply executables that take JSON files as input and write their outputs to disk
- Input **configuration JSON** files specify:
  - The locations of the *input* data on disk to process
  - The parameter values to use
  - The locations on disk to write the *output* data
- The ETA library defines a rich **type system** that all modules use to declare their I/O types
  - Allows modules to communicate seamlessly



### **Module Metadata Files**

- Each module provides a metadata JSON file
  - Enumerates the module's inputs, outputs, and parameters
  - Defines the type of each field
- Complete description of a module's operation
- Enables modules to be implemented in any language
- **Generated automatically** from source for modules built on ETA

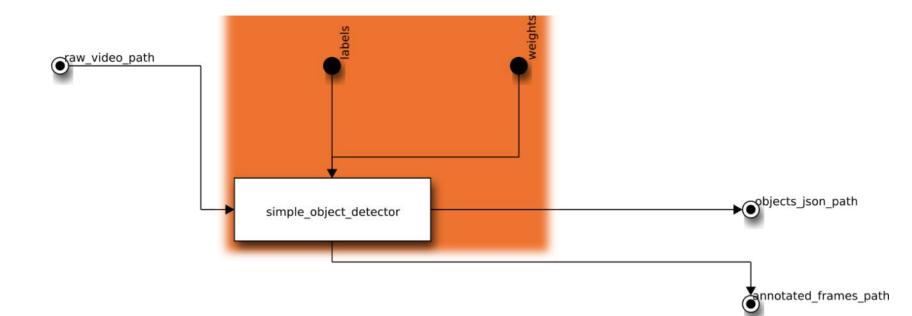




### **An ETA Module Visualized**

51

• Block diagram representation of a simple object detector:





# **Developing Modules in ETA**

- Powerful yet simple Python framework for building modules
- Built on popular open-source libraries (OpenCV, TensorFlow)
- Extensive core video library
  - Reading, writing, iterating over video frames
  - Supports all common video codecs
- Robust interface for serializing data to disk

Branch: develop +	eta / eta / core /
primoor now calling pipeline status caliback manually from inside the flush() 🖮	
940 C	
🖹 _initpy	lintinginit
Duilder.py	renaming log to logfile for consistency
Command.py	implementing command-line utility to build and run pipelines
config.py	updating module docstrings
🖹 diagram.py	updating to use new node terminology
events.py	linting
features.py	improving docstring of 'featurize_if_needed' decorator
geometry.py	technically inputs are coordinates, not RelativePoints. also minimify
🖹 graph.py	adding a simple DirectedGraph implementation with the ability to perf.
🖹 image.py	improving exception handling
job.py	removing newlines from logging, which aren't helpful
log.py	removing newlines from logging, which aren't helpful
🖹 module.py	adding documentation
numutils.py	fixing things for the PR on the CanFeature parts
Diects.py	add data classes for counting objects in images
pipeline.py	now calling pipeline status callback manually from inside the flush[]
🗟 serial.py	adding a Serializable.to_str() method
🗑 status.py	removing pipeline status callback handling from PipelineStatus class
types.py	fixing has_extenstion typo
🖹 utils.py	catching OSError for convenience
🖹 vgg16.py	refactored video featurizer code and vgg16 video featurizer code.
🖹 video.py	renamed "video.is_video" to "video.is_valid_video"
web.py	cleaning up web module and removing unnecessary CHUNK_SIZE
weights.py	updating to current import naming conventions

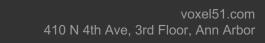
### Writing Modules in ETA

#### **ETA Module Definition**

```
import eta.core.module as etam
class ExampleModuleConfig(etam.BaseModuleConfig):
    '''An example config class.'''
   def __init (self, d):
        super(ExampleModuleConfig, self). __init__(d)
        self.data = self.parse object array(d, "data", DataConfig)
        self.parameters = self.parse_object(d, "parameters", ParametersConfig)
class DataConfig(Config):
    '''Data configuration settings.'''
   def __init__(self, d):
       self.input path = self.parse string(d, "input path")
       self.output path = self.parse string(d, "output path")
class ParametersConfig(Config):
    '''Parameter configuration settings.'''
   def __init__(self, d):
       self.parameter = self.parse number(d, "parameter", default=1.0)
```

#### **Example JSON Config**

```
{
    "data": [
        {
            "input_path": "/path/to/input.mp4",
            "output_path": "/path/to/output.mp4"
        }
    ],
    "parameters": {}
}
```



# **Core Video Analytics: Now**

#### **Current Core Video Analytics**

- Deep (VGG-16) and standard (SURF, ORB, weighted histogram, etc.) embeddings
- Deep (C3D) and standard (per-frame-voting) video embedding
- Object detection
- Object tracking
- Per-frame and clip-level event detection
- Visual image similarity search

#### **Current Road-Related Analytics**

- Vehicle and road sign detection
- Fine-grained vehicle recognition (type, make, model, color)

#### **Current Surveillance-Related Analytics**

- Action recognition
- Target reacquisition



### **Core Video Analytics: Soon!**

#### **Upcoming Road-Related Analytics**

- *Improved* fine-grained vehicle recognition
  - Using object tracking to increase accuracy
  - Integrating license plate recognition (LPR)
- Road scene understanding (lanes, markings, intersections)

#### **Upcoming Surveillance-Related Analytics**

- Action recognition models trained on a database of criminal activity video
- Assessing building exterior quality from aerial/street images
- Target search via linguistic description

#### **Related Efforts**

• Support for streaming video

#### We are willing and able to train custom models on your data!



### **Pipeline Metadata Files**

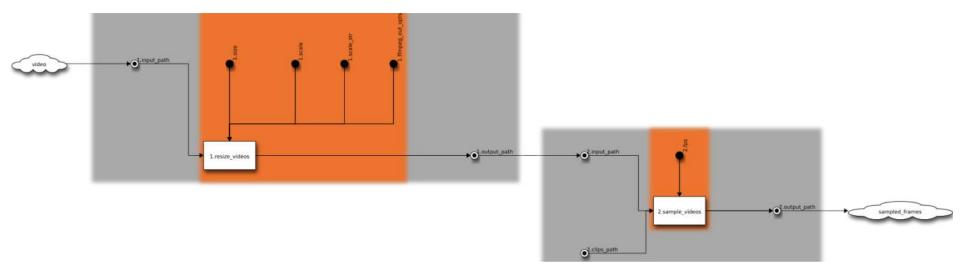
- Pipelines are defined by simple metadata
   JSON files
- Describes the **module connections** that define the execution graph
- Sets parameters for the constituent modules
- Exposes tunable parameters to the user

```
"info": {
    "name": "video_formatter",
    "type": "eta.core.types.Pipeline",
    "version": "0.1.0",
    "description": "A pipeline for formatting video files"
Ъ,
"inputs": ["video"],
"outputs": ["sampled_frames"],
"modules":
        "name": "resize_videos",
        "tunable_parameters": ["size", "scale"],
        "set_parameters": {}
        "name": "sample videos",
        "tunable_parameters": ["fps"],
        "set parameters": {}
1,
"connections": [
        "source": "INPUT.video",
        "sink": "resize_videos.input_path"
   },
        "source": "resize videos.output path",
        "sink": "sample videos.input path"
        "source": "sample videos.output path",
        "sink": "OUTPUT.sampled frames"
```



## **An ETA Pipeline Visualized**

• Block diagram representation of a simple pipeline:





# **The Voxel51 Vision Services API**





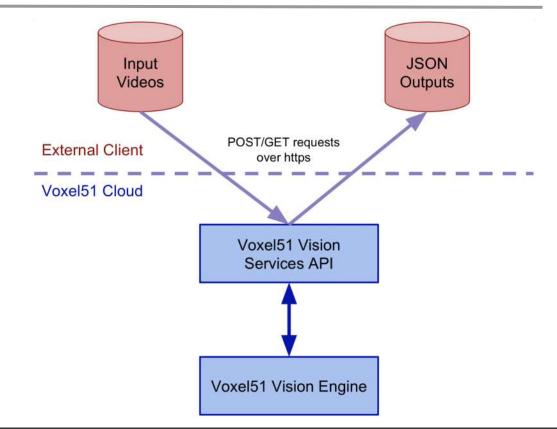
# Vision Services API

- Canonical **cloud-based interface** through which users interact with ETA
- Accessible via standard HTTPS requests
- Also provide client libraries to access the API programmatically from Python and JavaScript
- Lives in **Google Cloud**, with plans to provide a parallel deployment in **Amazon Web Services**
- Full documentation at <a href="https://voxel51.com/docs/api">https://voxel51.com/docs/api</a>

The Vision Services API is currently in private beta. Visit our website at <a href="https://voxel51.com">https://voxel51.com</a> to request an invitation to use our platform!



#### **Vision Services API Design**





## **Voxel51 Vision Engine**

- Scalable cluster of **Docker containers**, each of which contains a copy of the ETA Library
- Deployed via Kubernetes, a open-source platform for managing containerized workloads
- Cluster **scales automatically** to allocate resources on-demand in response to user job requests
- Runs jobs **asynchronously** as resources become available



# **Typical User Workflow**

- **Register** for our API and obtain an authentication token (one-time only)
- **Upload data** to the cloud via the API
- Schedule analytics to be run on your data by issuing job requests via the API

(Tasks run asynchronously in the Voxel51 Cloud)

- Periodically ping the API to **check the status** of your jobs
- When tasks finish, issue an API request to **download the outputs**, which are concisely represented in a flexible JSON format



# **Example Applications**

#### **Target Reacquisition**

- User provides a video corpus (e.g. surveillance camera network) and example image(s) of an entity of interest
- System queries the corpus and returns best-matches for the entity across the corpus

#### Linguistic Description Retrieval

- User provides a video corpus and a **natural language description** of an entity of interest
  - Ex: "red pickup with a dented front bumper"
- System queries the corpus and returns best-matches Target reacquisition is currently available on our beta platform!



#### **Target Reacquisition**

• Toy example of a target reacquisition query:

#### **Visual Query**



#### **Video Corpus**





# **Linguistic Description Query**

• Toy example of a linguistic description query:

#### Linguistic Query

*"blue sedan with tape holding on the front-bumper"* 

#### **Video Corpus**





#### **API Usage: Data Upload**

• Uploading data in Python:

```
from voxel51.api import API
api = API()
# Upload surveillance corpus
for video in surveillance_corpus:
    response = api.upload data(video, dataset="surveillance-20180320")
dataset id = response["dataset id"]
# Upload query image
response = api.upload data("suspect-vehicle.png")
data id = response["data id"]
```



#### **API Usage: Job Request**

- Example request for a target reacquisition query:
- Query image and video corpus were previously uploaded to the Voxel51 Cloud
- Data referenced by IDs in the job request

```
"name": "target-reacquisition",
    "algorithm": "similarity-search",
    "data": {
        "query-image": {
            "data id": "<data-id>",
        },
        "video-corpus": {
            "dataset id": "<dataset-id>"
    1,
    "parameters": {
        "top k": 10
}
```



#### **API Usage: Job Request**

• Example request for a linguistic retrieval query:

```
{
    "name": "semantic-language-query",
    "algorithm": "natural-language-search",
    "data": {
        "query-string": "blue sedan with tape holding on the front-bumper",
        "video-corpus": {
            "signed_url": "https://storage.googleapis.com/XXXXXX"
        }
    },
    "parameters": {
        "top_k": 10
    }
}
```

#### Note that data can be accessed from an external cloud via signed URLs



#### **API Usage: Running a Job**

• Running a job and checking its status:

```
# Upload job request
response = api.create_job("job.json")
job_id = response["job_id"]
```

```
# Start job
api.start_job(job_id)
```

```
# Check job status
response = api.get_job_status(job_id)
```

```
HTTP/1.1 201 OK
{
    "job_id": "<job-id>",
    "status": "COMPLETE",
    "start_time": "2018-03-21 08:30:00",
    "completion_time": "2018-03-21 08:32:30",
    "message": "Job complete"
}
```



#### **API Usage: Job Output**

• Example output for a target reacquisition query:

}

# Download job output api.download\_job\_output(job\_id, "output.json")

```
"top_matches": [
        "confidence": 0.850,
        "video": {
            "data_id": "<data-id>",
        },
        "frame": 150,
        "bounding box": {
            "top_left": {"x": 0.125, "y": 0.100},
            "bottom right": {"x": 0.250, "y": 0.300}
    },
```

