

**AI BUSINESS DRIVEN TRANSFORMATION:
BOOST OR HYPE?**

Quick Introduction

/S



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SoftConstruct conducts basic and applied research in four key areas: data science, computer vision, big data, real-time processing. Our experience is extremely wide: from working with complex computer and engineering systems, programming for data science — to developing and putting into practice innovative solutions in the field of sports, eSports and security.

Area Definition

Research Institute, Lab

- A new approaches, hypothesis
- Way to state-of-the-art
- ..new possibility in general
- Make world better
- Papers as product, maybe with code :)
- Fighting against restrictions
- Grant, research programs
- effectiveness

Product company on the market

- Product delivered to the clients
- Time to market
- Working service as product
- Manageable code base
- Dealing with environment restriction
- Dealing with integration restriction
- Investment effectiveness



In the beginning was the Dream, and the Dream was good.

Stable business with market share

Recognizable **brand** on the market

> 400 partners on the platform in 11 geo zones

Two guys **who dreamed** about boost business with AI

SOFTCONSTRUCT,
2 years ago





Days gone...

That was the true Dream, kindles everyone who comes to the company.

Now around 60 people in 5 AI projects

Project areas: Risk management, fraud, detect image forgery / forensic

Sport tech : video semantic extraction, player effectiveness, tactical analysis

Real Time Stream, CV, quantitative analysis, Edge AI

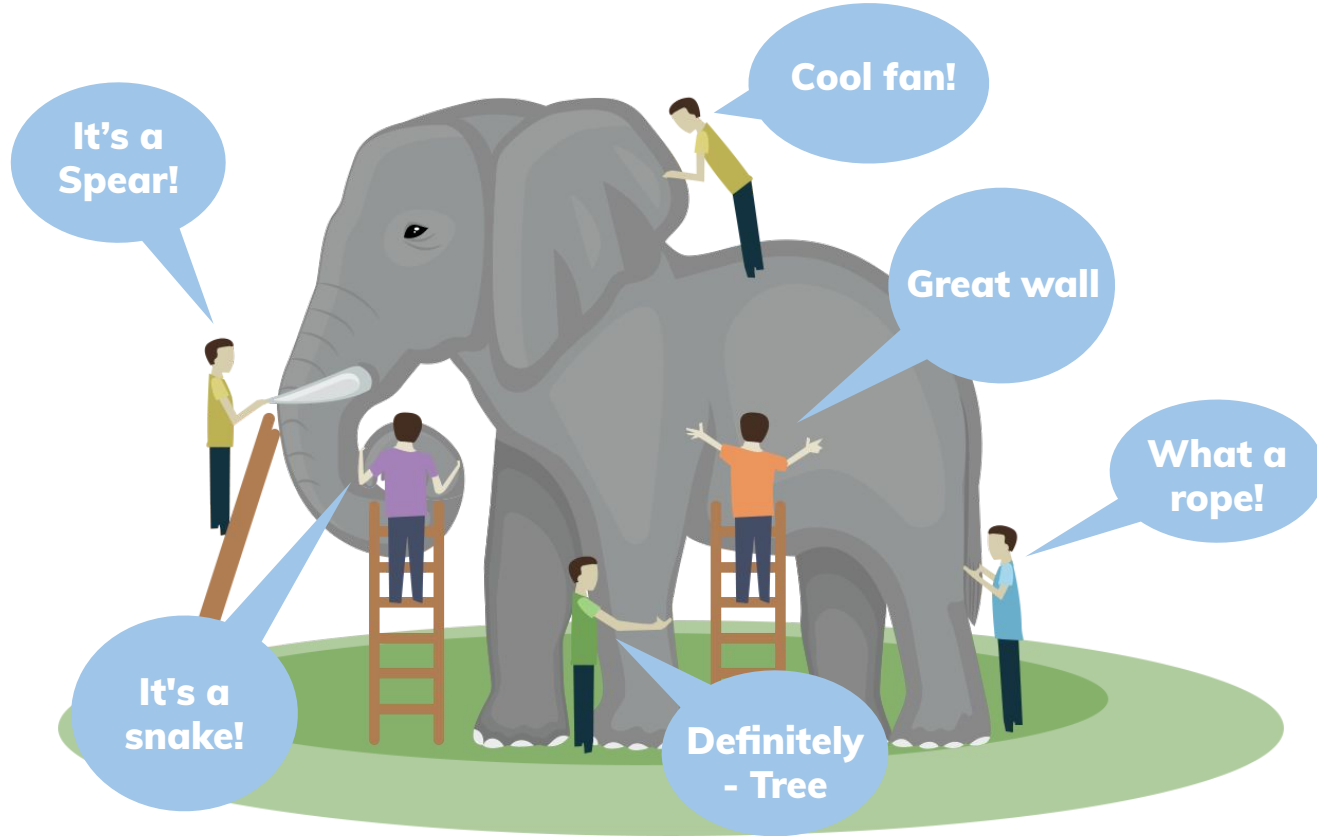
SOFTCONSTRUCT,
our days



[?]

Lessons
learned

What's your Domen, man?



Optimal algorithm

When your first model simple and you have a manageable infrastructure

When you know the freshness requirements of your system

Problems detection before pushing model on prod

Start with interpretable model



Data

No matter how good your models are, they are only as good as your data

Practice says: recent or available data just isn't enough to predict always there. Is too much missing information and undefined influences around. Data always not enough.

Don't start project if you don't know where your data



18 games

recorded with our hardware



9 different stadiums

were captured



30+h of videos

tested with our system



>2m images

dataset



Auto-labeling

videotool

Data management

“Let's do it later” - It is great wrong strategy

Data sources readiness

Data quality

Version control schema : data + models

Controllability



+



git

+



Extra Metadata

Product

Don't expect that the model you are working on now will be the last one that you will launch

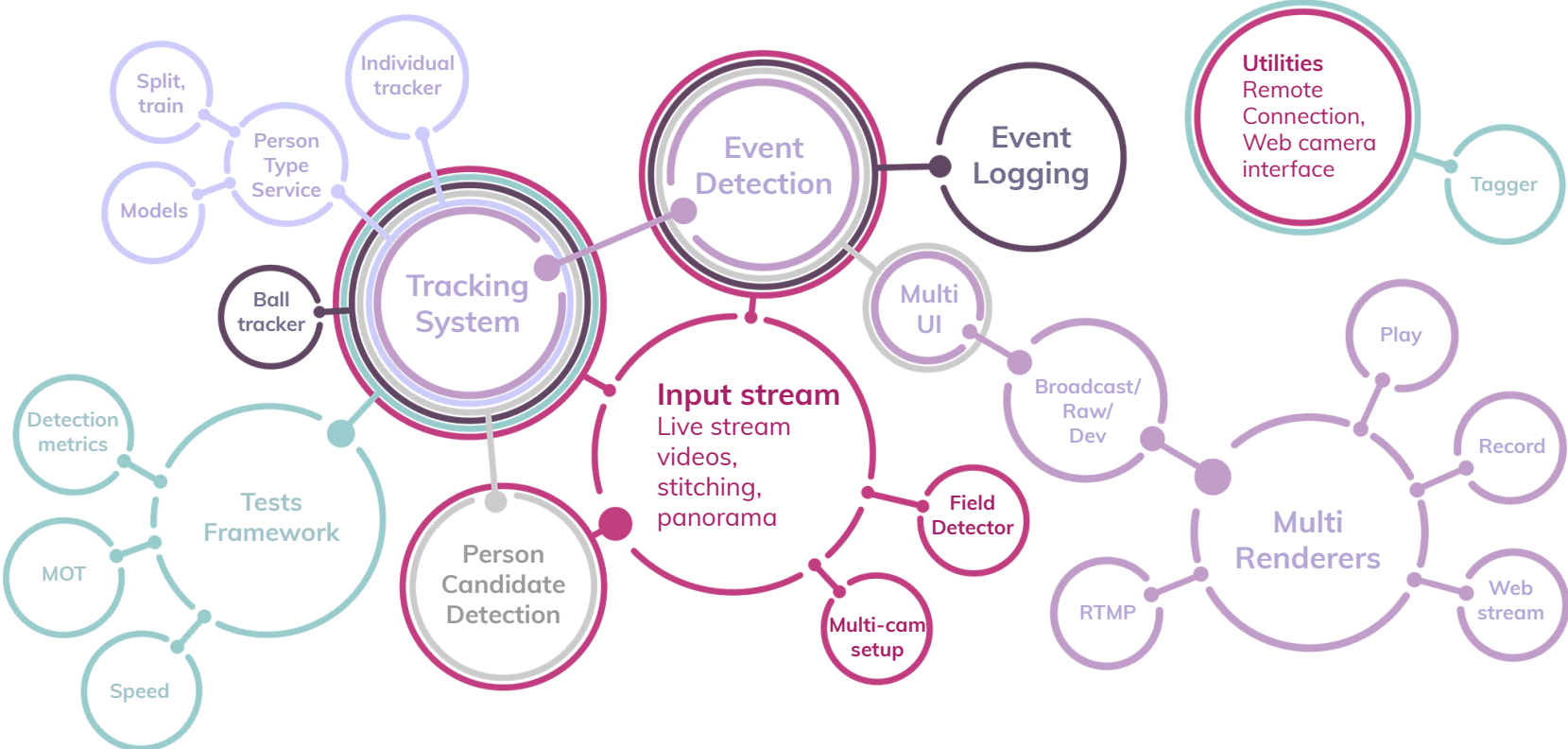
Don't be afraid to launch without ML, but prefer ML over a complex heuristic

You should always have an objective quantitative assessment of your changes.

Measure the delta between models.

Optimal : **build framework, manageable pipeline**

Product



Test - benchmark - profile

```
./main.py --test PersonTracking:#mot --corners-from-config --use-pretrained-team-classifier
```

Summary:

| | FRAMES | GT | Recall | Precision | MT | PT | ML | FP/frame | FN/frame | Switch/frame | Lost/frame | MOTA | MOTP |
|-----------------|--------|----|--------|-----------|----|----|----|----------|----------|--------------|------------|-------|-------|
| full | 1000 | 23 | 80.2% | 85.4% | 15 | 7 | 1 | 3.15 | 4.55 | 0.42 | 0.04 | 64.7% | 71.7% |
| frames:0-100 | 100 | 23 | 76.5% | 91.5% | 14 | 8 | 1 | 1.64 | 5.40 | 0.04 | 0.04 | 69.2% | 70.2% |
| frames:100-200 | 100 | 23 | 88.9% | 88.9% | 19 | 3 | 1 | 2.55 | 2.55 | 0.02 | 0.01 | 77.7% | 73.8% |
| frames:200-300 | 100 | 23 | 87.0% | 87.0% | 18 | 4 | 1 | 3.00 | 3.00 | 0.08 | 0.07 | 73.6% | 69.6% |
| frames:300-400 | 100 | 23 | 85.8% | 85.8% | 19 | 1 | 3 | 3.27 | 3.27 | 0.40 | 0.01 | 69.8% | 70.5% |
| frames:400-500 | 100 | 23 | 75.3% | 80.9% | 16 | 3 | 4 | 4.08 | 5.67 | 0.78 | 0.02 | 54.2% | 71.5% |
| frames:500-600 | 100 | 23 | 68.7% | 82.6% | 14 | 3 | 6 | 3.32 | 7.21 | 0.61 | 0.03 | 51.6% | 72.2% |
| frames:600-700 | 100 | 23 | 78.0% | 83.4% | 14 | 7 | 2 | 3.58 | 5.07 | 0.51 | 0.02 | 60.2% | 71.5% |
| frames:700-800 | 100 | 23 | 79.2% | 82.0% | 16 | 4 | 3 | 4.00 | 4.79 | 0.51 | 0.02 | 59.6% | 73.0% |
| frames:800-900 | 100 | 23 | 81.5% | 82.4% | 19 | 0 | 4 | 4.00 | 4.26 | 0.79 | 0.00 | 60.7% | 71.3% |
| frames:900-1000 | 100 | 23 | 81.6% | 90.1% | 19 | 0 | 4 | 2.06 | 4.24 | 0.44 | 0.01 | 70.7% | 73.7% |

Metrics description:

- FRAMES - total number of frames
- GT - number of unique groundtruth objects
- Recall - **true** positives / groundtruth positives
- Precision - **true** positives / predicted positives
- MT - **'mostly tracked'**: number of objects tracked **for** at least 80% of lifespan
- PT - **'partially tracked'**: number of objects tracked between 20% and 80% of lifespan
- ML - **'mostly lost'**: number of objects tracked less than 20% of lifespan
- FP/frame - **false positives** / number of frames
- FN/frame - **false negatives** / number of frames
- Switch/frame - total number of track switches
- Lost/frame - total number of switches from tracked to not tracked
- MOTA - **'mot accuracy'**: $1 - (fn + switches + fp) / \text{number of all gt objects appearances}$
- MOTP - **'mot precision'**: average distance value **for true** positives

Test - benchmark - profile

```
./main.py --test BallTracking:BallQuality --corners-from-config --multiple-ball-areas
```

```
./main.py --pipeline-type broadcast --test BroadcastUI:#accuracy
```

| Metrics | Value |
|---|-------|
| ----- | ----- |
| Frames | 1500 |
| Frames with ball | 1251 |
| Ball visible (% of frames with ball) | 84.5 |
| Ball in center zone (% of frames with ball) | 60.8 |
| Players in center zone - average | 6 |
| Players in center zone - median | 6 |
| 0 players in center zone (% of frames) | 3.4 |

```
./main.py --pipeline-type broadcast --test PersonCandidateDetection:#speed
```

```
./main.py --test PersonTracking:#determinism
```

...

Test - benchmark - profile

BroadcastUI signal processing duration (in seconds):

| signal | count | total | mean | min | max | median | 99th percentile |
|---------------------------|-------|-------------|-------------|-------------|-------------|-------------|-----------------|
| BALL_STATE | 670 | 0.0285463 | 4.26065e-05 | 1.04904e-05 | 0.009022 | 2.59876e-05 | 8.92091e-05 |
| FRAME_PROCESSING_FINISHED | 1340 | 6.59752 | 0.00492352 | 6.19888e-06 | 0.0342135 | 0.00101352 | 0.0224347 |
| NEW_FRAME | 670 | 4.29172 | 0.00640555 | 0.00328159 | 0.167054 | 0.00548327 | 0.0195191 |
| PERSON_CANDIDATE_DETECTED | 669 | 0.0769982 | 0.000115095 | 7.39098e-06 | 0.0052669 | 7.9155e-05 | 0.000903273 |
| STREAM_INFO | 1 | 0.000628948 | 0.000628948 | 0.000628948 | 0.000628948 | 0.000628948 | 0.000628948 |

Total duration: 11.00 seconds

BallTracking signal processing duration (in seconds):

| signal | count | total | mean | min | max | median | 99th percentile |
|---------------------------|-------|-----------|-------------|-------------|------------|-------------|-----------------|
| NEW_FRAME | 671 | 15.5682 | 0.0232015 | 0.00594878 | 0.0745683 | 0.0146971 | 0.0677459 |
| PERSON_CANDIDATE_DETECTED | 670 | 0.0141108 | 2.10609e-05 | 7.62939e-06 | 0.00153089 | 1.45435e-05 | 5.31888e-05 |
| STREAM_INFO | 1 | 3.21015 | 3.21015 | 3.21015 | 3.21015 | 3.21015 | 3.21015 |

Total duration: 18.79 seconds

PersonCandidateDetection signal processing duration (in seconds):

| signal | count | total | mean | min | max | median | 99th percentile |
|-------------|-------|---------|-----------|------------|-----------|-----------|-----------------|
| NEW_FRAME | 671 | 20.9047 | 0.0311546 | 0.00581479 | 0.0835006 | 0.0281644 | 0.0683036 |
| STREAM_INFO | 1 | 3.21918 | 3.21918 | 3.21918 | 3.21918 | 3.21918 | 3.21918 |

Total duration: 24.12 seconds

InputStream signal processing duration (in seconds):

| signal | count | total | mean | min | max | median | 99th percentile |
|----------------------|-------|-------------|-------------|-------------|-------------|-------------|-----------------|
| READY_FOR_NEXT_FRAME | 2010 | 44.8919 | 0.0223343 | 1.90735e-06 | 0.106913 | 9.05991e-06 | 0.0947219 |
| STREAM_INFO | 1 | 0.000326395 | 0.000326395 | 0.000326395 | 0.000326395 | 0.000326395 | 0.000326395 |

Total duration: 44.89 seconds

Development cycle transformation

Hardware



NVIDIA
XAVIER

Coral

Frameworks

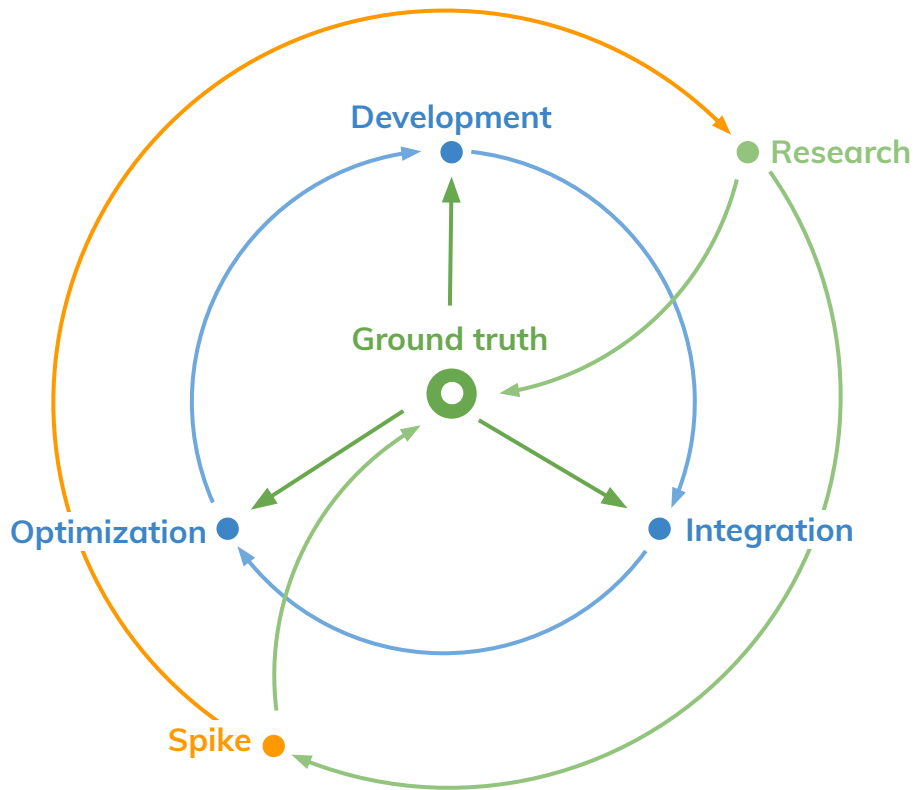


TensorFlow



PYTORCH

{ } ARRAYFIRE



arXiv.org

PubMed

PLOS

ResearchGATE
scientific network



How it works: ICE 2019 Futsal tournament.

February 2019

Vanila Alpha-Pose
plus
Our optimization
=
x7 faster

High-precision, real-time,
zero operator's assistance,
video analysis tool for
in-game events extraction,
object tracking and
situation reconstruction for
advanced game analytics
and sport betting
applications.



Right people

Works

- System, critical thinking - be ready to answer “why this works in that way?”
- Specialization on board: Data Structures and Algorithms
- Ability to express oneself in code
- Balance of autonomy and interaction

Does't work

- Speed courses
- Magic thinking

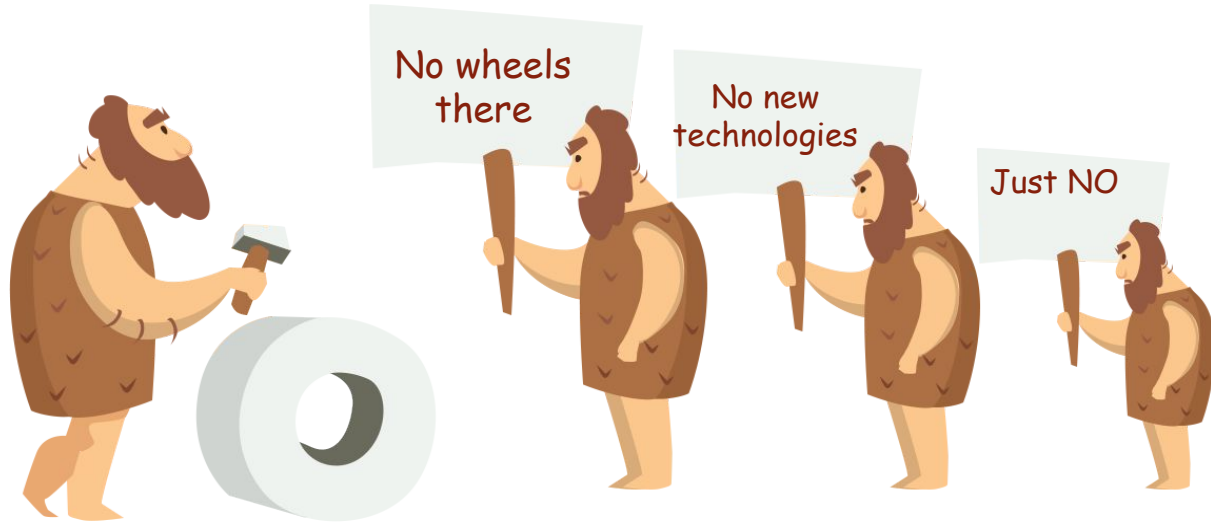
Integration and Resistance

AI It is always **road to the operational effectiveness**, means reducing the influence of a person in the mass and increasing the requirements for individual skills, broadening the horizon of opportunities.

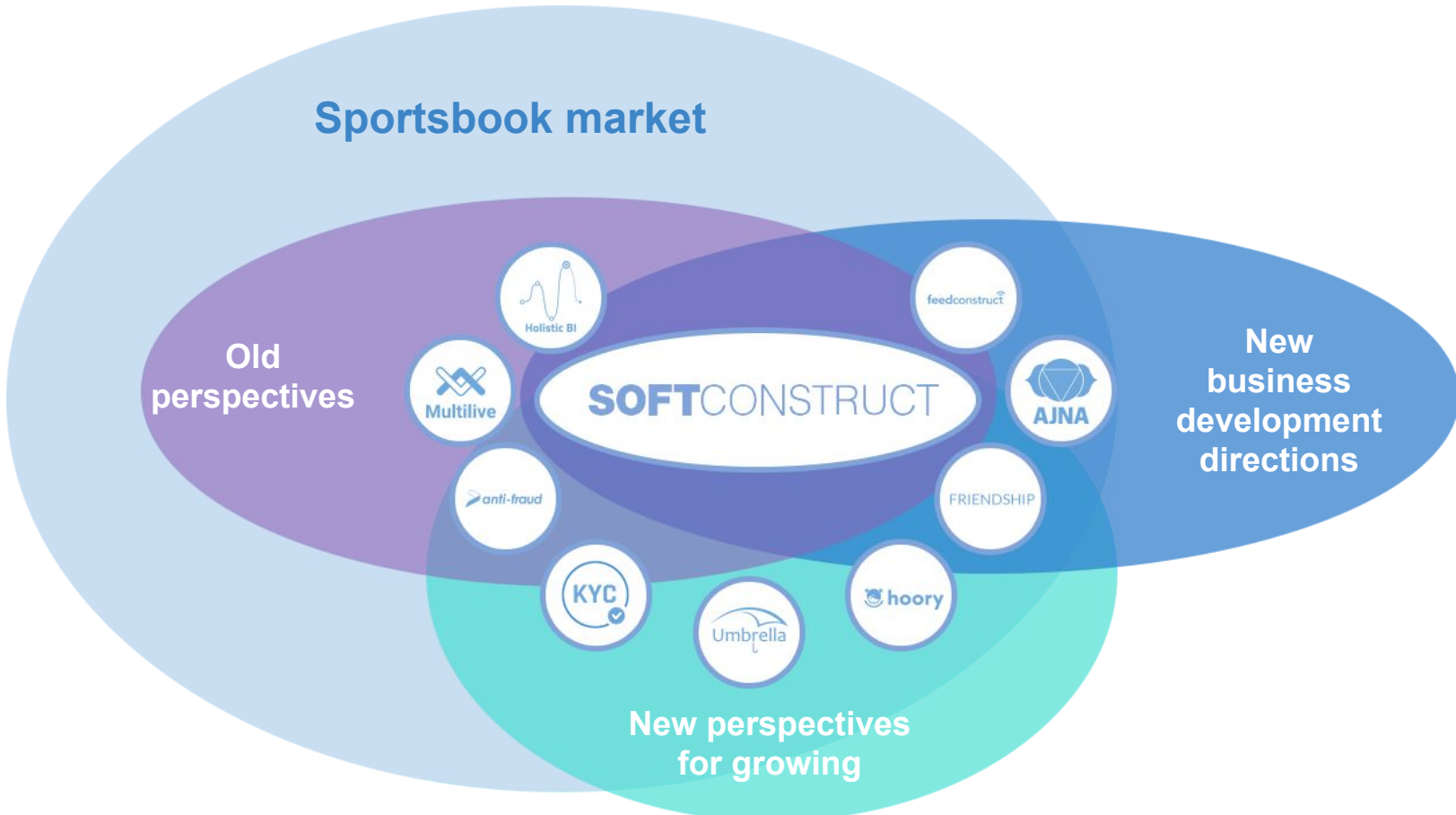
We can forgive a human without expecting 100% efficiency from him, but are not internally ready for this for AI powered automated systems.

Nothing happens without storytelling :)

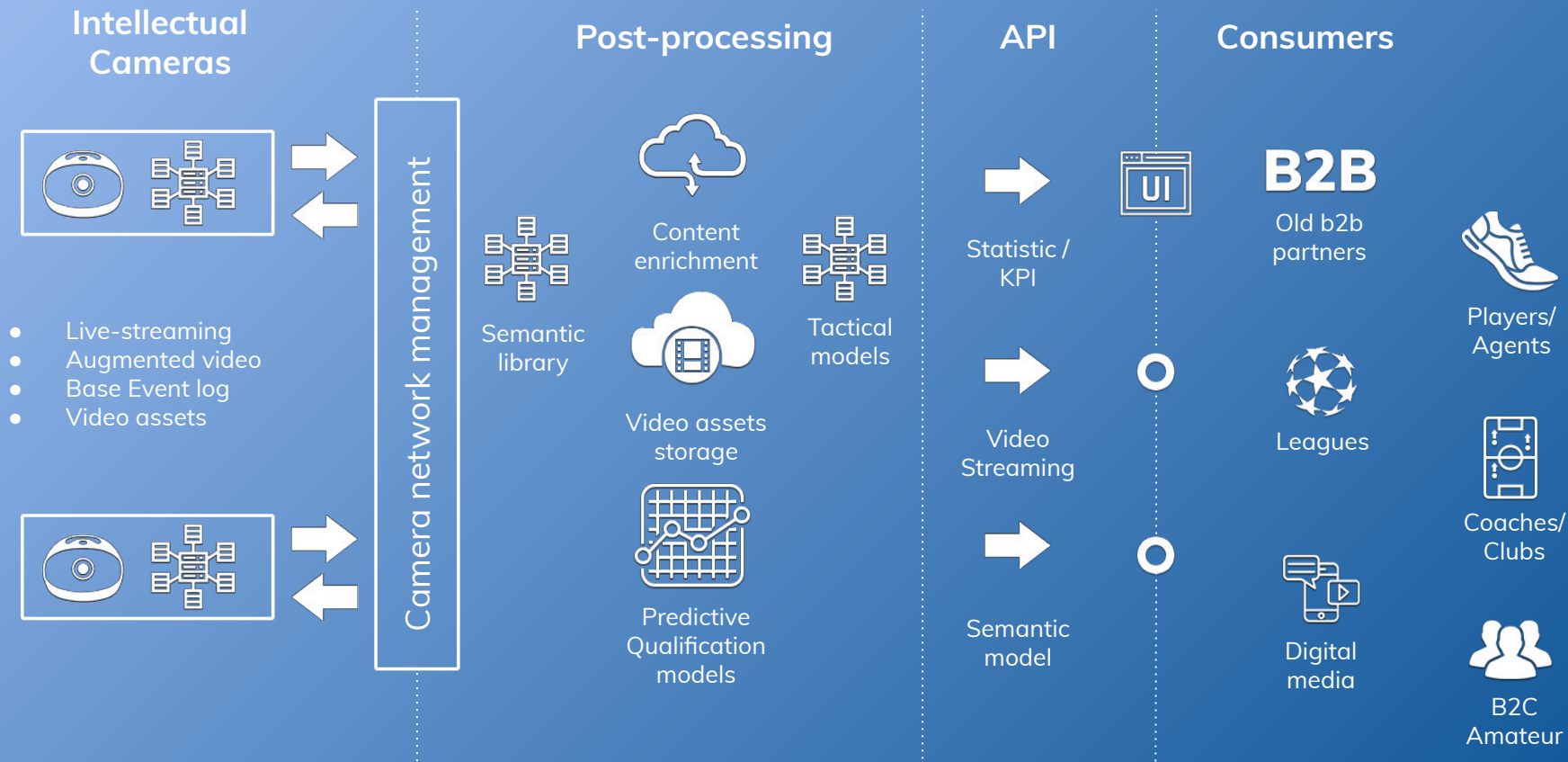
Be a iterative



Business area extension



Game semantic ecosystem



Our mentor and partner



Thanks!



Any

Questions?

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