# Beyond the Hype: A Critical Look at AI in Video Streaming

Jan Ozer Streaming Learning Center jan.ozer@streaminglearningcenter.com

# Online Course for New Streaming Professionals



#### **Streaming Media 101:**

#### **Technical Onboarding for Streaming Media Professionals**

Learn the technologies, techniques, and skills to succeed in a streaming media-related role, whether it's producing and distributing streaming video or creating the tools and services necessary to do so.

https://bit.lv/StreamingMedia101

#### What You Will Learn

In about 11 hours, this online course will teach you the terms, technologies, best practices, and skills needed to excel in a technical role in the streaming media industry. You will learn:

- How to encode and deploy streaming video using the H.264, HEVC, VP9, and AV1 codecs
- How to encode for single file and adaptive bitrate encoding and packaging for HLS, DASH, and CMAF
- About digital rights management (DRM) and distribution issues like choosing a CDN and how to measure and ensure Quality of Service and Quality of Experience
- Critical production-level decisions, like whether to encode on-premise or in the cloud, how to choose a per-title encoding technology and cloud encoder, and how to compute the breakeven on deploying an advanced codec like HEVC or AV1

#### You will learn to:

- Analyze files with MediaInfo, Bitrate Viewer, Apple's AVQT, and the Moscow State University Video Quality Measurement Tool
- Encode in FFmpeg and Handbrake
- ✓ Produce mezzanine files for upload to a streaming service
- ✓ Connect to YouTube Live and Facebook Live
- Embed a live or on-demand video into a web page



# **Agenda**

- How to consider AI in your buying decisions
- Survey of Al applications
- Summary and conclusion

# The Best Way to Consider Al in Streaming-Related Product and Services is to ...

# The Best Way to Consider Al in **Streaming-Related Product** and Services is to ... Ignore it completely

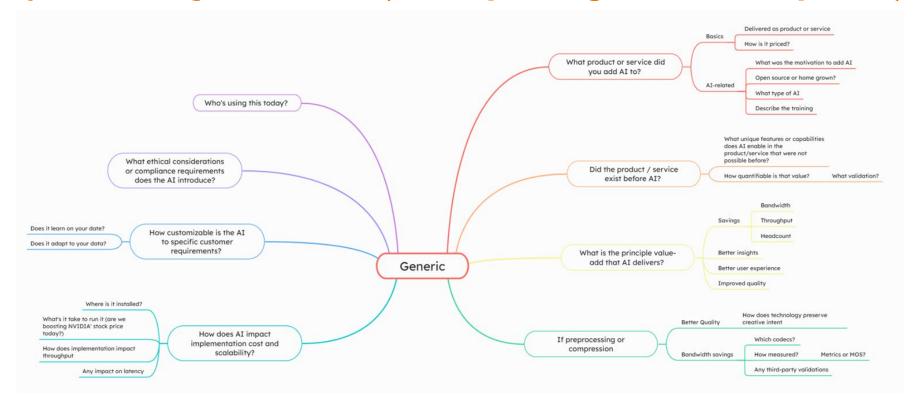
# Why?

- Not to say that AI hasn't already made significant contributions, which will only grow in the future
- But, you buy a whole product/service
- Doesn't matter if it's powered by AI or a gasoline engine;
  - If it delivers the required ROI or equivalent measure you use to make purchasing decisions, buy it
  - Not because it says Al
- Evaluate the whole product like you always did
  - If interested in AI, here are some suggested questions

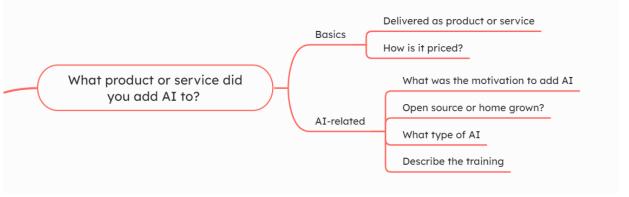
## I Was Interested to See How AI Was Being Used

- Announced the session on LinkedIn
- Interviewed any interested company with deployed AI-basedtechnology from preprocessing through distribution
  - Spoke to 12, a tiny fraction of companies implementing AI in the space
  - Tried to understand what they were doing with Al
  - Recorded interviews available on YouTube
- Developed questionnaire that you might find useful

# My Evolved Question List (after speaking with 11 companies)



**Introductory Questions** 



- Basics
  - Product or service how delivered?
  - Pricing
- Why add Al?
- Open source or home grown
  - If open source, what's the value add that differentiates from other services (Ampere/NETINT/Whisper- throughput)
  - Open source = minimum control
  - Home grown requires more engineering but should deliver competitive advantage

#### What type of Al

- ML Machine learning analyzes data to find patterns and make accurate predictions
- Generative AI creates new data that resembles the training data
  - Interactive and free-form

# **Introductory Questions**

Did the product / service exist before AI?

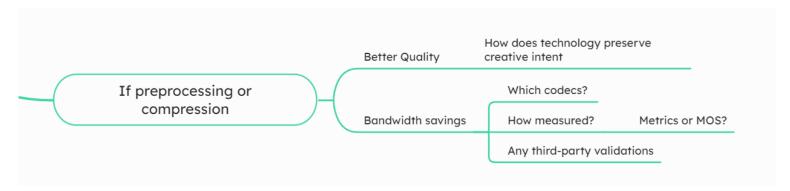
What unique features or capabilities does AI enable in the product/service that were not possible before?

How quantifiable is that value?

What validation?

- Today, most products existed without Al, so it was incorporated to add features, performance, or both
- Try to identify key benefit:
  - Is it quantified or general?
  - Is it validated by a third-party
    - Usually a customer

# **If Compression**

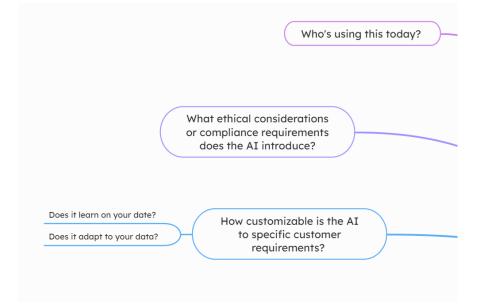


- More questions about added value
- Compression claims are typically vague and unsupported
  - That's why you run your own tests
- If preprocessing, "improve quality" claims
  - Typically optional but verify that you can disable?
  - How to preserve creative intent?
  - Hacking? Check VMAF/PSNR/SSIM

#### Bandwidth savings

- Which codecs? Impact of H.264 likely different that AV1 or VVC
- How measured?
  - Objective VMAF/PSNR
  - Subjective MOS (the gold standard, but expensive)
  - Typically not validated by thirdparties other than customers

# **Misc Questions**



- Does the Al adjust to your data (or file inputs)?
  - Seldom does
- Any privacy issues?

Who is using - get third party validations

## **Bottom Line with Compression:**

- Questions must be asked, but aren't terribly useful
- Very few academic peer reviewed studies
- Even if they did exist, you care about:
  - Your footage
  - Your codecs
  - Your encoding parameters
  - Never an apples-to-applies mix
- When it comes to compressionrelated technology, you're going to have to test

- And again,
  - Al is only a component
  - Almost impossible to discern from other techniques
  - You care about whole product performance

# Al Companies (and Others) That I spoke With

**Preprocessing** 



**Encoding** 

**Captions** 



Customer **Experience** 



Ad Ops













- Digital Harmonics
- VideoOn

- Harmonic
- Visionular
- Bitmovin (Super-Rez)
- Codec Market
- Deep Render
- InterDigital

Interra

#### See also:

- Nanocosmos
- NETINT
- Ampere

• IMAX

- Media Distiller
- See also:
- Amagai

- Bitmovin
- Operative
- Operative

# **Digital Harmonic - Keyframe**

- What: Preprocessor with both quality improvement and bandwidth reduction
- **Product or service:** Product
- Exist before AI: Yes
- Benefit of Al: Improved performance in both modes
  - Adaptive entropy minimization
  - De-artifacting, De-noising, and Deblocking
  - Anti-aliasing
- Bold claim: Up to 80% bitrate reduction with no loss in quality (PSNR/MOS)
  - Quality improvement to better than source
- Which codecs: Agnostic



#### Implementation:

- Installed pre-encoder (bump in the wire)
- Needs GPU-based system to run
- Throughput varies with processing (quality/bandwidth reduction)

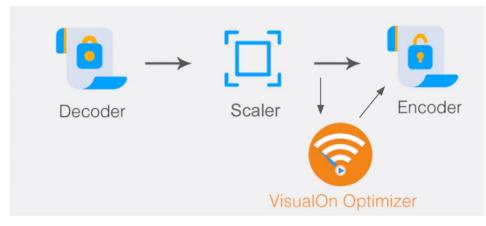
#### For more information:

- https://www.dhkeyframe.com/
- Interview <a href="https://bit.ly/LI\_DH">https://bit.ly/LI\_DH</a>

# **VisualOn Optimizer**

- What: Preprocessor with both quality improvement and bandwidth reduction (CAE)
- **Product or service:** Product
- Exist before AI: Yes
- Benefit of AI: Improved performance in both modes
- Bold claim: Up to 70% bitrate reduction with no loss in quality (VMAF)
  - Quality improvement to better than source
- Which codecs: Agnostic





#### • Implementation:

- o Integrates via API
- Runs on the same system as the encoder, and doesn't negatively affect throughput

#### For more information:

- o <u>www.visualon.com</u>
- Interview: <a href="https://youtu.be/B9Bl\_YdAj78">https://youtu.be/B9Bl\_YdAj78</a>

# Harmonic: PURE/EyeQ

- What: Al-based compression technology used by ~ 100 customers
- Product or service: both
- Exist before AI: PURE yes/EyeQ no
- Benefit of AI: Improved compression efficiency
- Bold claim: 50% greater efficiency than open source
- Implementation:
  - Appliance
  - Cloud service



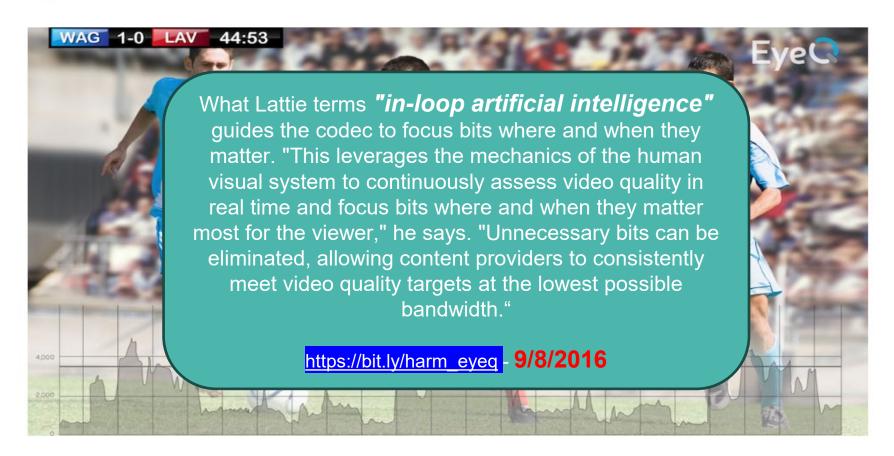




#### • For more information:

https://www.harmonicinc.com/
 Interview video:
 https://youtu.be/tPDPcN21CNg

# Harmonic Claims 50% OTT Performance Improvements with EyeQ



#### **Visionular**

- **What:** H.264, H.265, and AV1 codecs
- **Product or service:** Both
- Exist before Al: No integrated from the start
- Benefit of AI: Improved compression efficiency
- Bold claim: Up to 50% bitrate reduction compared to open source
- Implementation:
  - License codecs
  - Use cloud service



ISE CASES PRODUCTS V RESOURCES

# Smaller Videos. Great Quality. A.I. Inside.

- For more information:
  - www.visionular.com
  - Interview https://youtu.be/k44QdGMjN5U

# Advances in Video Compression Systen Deep Neural Network Review and Case Str

This article targets video coding improvements for both inc video encoder and jointly across multiple blocks including reviews various modules in video coding that could be provides case studies for each of these modules

September 2021

Zoe Liu received the B.E. degree (Honsors) and the M.E./Ph.D. degree from Tsinghua University, Beijing, China, in 1995 and 2000, respectively, and the Ph.D. degree from Purdue University, West Lafayette, IN, USA, in 2004, all in electrical engineering.



She was a Software Engineer with the Google WebM Team, Mountain View, CA, USA, and has been a key contributor to the

newly finalized royalty-free video codec standard AOM/AV1. She has been devoted to the design and development of innovative products in the field of video codec and real-time video communications for almost 20 years. She is the Co-Founder and the President of Visionular Inc., Palo Alto, CA, USA, a startup delivering cutting-edge video solutions to enterprise customers worldwide. She was a 2018 Google I/O speaker. She has published approximately 50 international conference papers and journal articles. Her main research interests include video compression, image processing, and machine learning.

By Dandan Ding<sup>®</sup>, Member IEEE, Zhan Ma<sup>®</sup> nior Member IEEE, Di Chen<sup>®</sup>, Member IEEE, Qingshuang Chen, Member IEEE, Zoe Liu, and Fengqing Zhu<sup>®</sup>, Senior Member IEEE

#### **Codec Market**

- What: Integrated cloud platform (encode/player/CMS/CDN)
- **Product or service:** Service
- Exist before AI: No integrated from the start
- Benefit of AI: Improved compression efficiency
- Al Component: Open-source advanced implemenation of VMAF
- **Bold claim:** 30% more efficient than open source
- Implémentation
  - Use cloud service

#### **Machine Learning**

Codec Market leverages
machine learning
techniques that optimize
secure encoding at scale for
video-on-demand libraries
and, soon, live-streamers

- For more information:
  - <a href="https://www.codecmarket.com/">https://www.codecmarket.com/</a>
  - Interview <a href="https://youtu.be/Dme1Q2fYEuE">https://youtu.be/Dme1Q2fYEuE</a>

# **Bitmovin Super-Resolution**

- What: Scaling at ultra-high quality
- Why: Scale low resolution source content to HD and higher for superior quality distribution
- Product or service: Service
- Exist before AI: Yes
- Benefit of AI: Improved quality
- Implementation
  - Component of transcoding service



VIDTECH

# Video Tech Deep Dive: Super-Resolution with Machine Learning P1



Jameson Steiner

20 May 2020 · 5 min read

#### For more information

- https://bitmovin.com/encoding-service
- Interview <a href="https://youtu.be/rTm26JRlkBQ">https://youtu.be/rTm26JRlkBQ</a>

#### **Bitmovin**



|Bicubic|



|Super-resolution|

# **Deep Render**

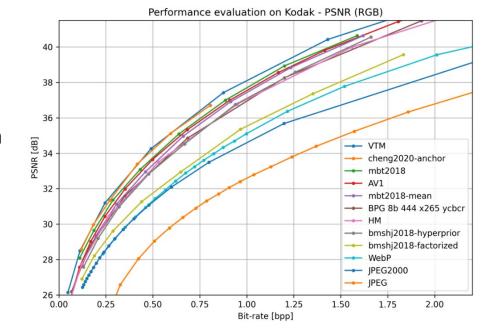


- What: "DeepRender is the world's only Al -based codec company"
- **Product or service:** product
- Exist before AI: No
- Bold claim: 45% greater efficiency than
   VVC

- Implementation:
  - License
- For more
  - www.deeprender.ai
  - Interview: <a href="https://youtu.be/L6cy6MyGkR4">https://youtu.be/L6cy6MyGkR4</a>

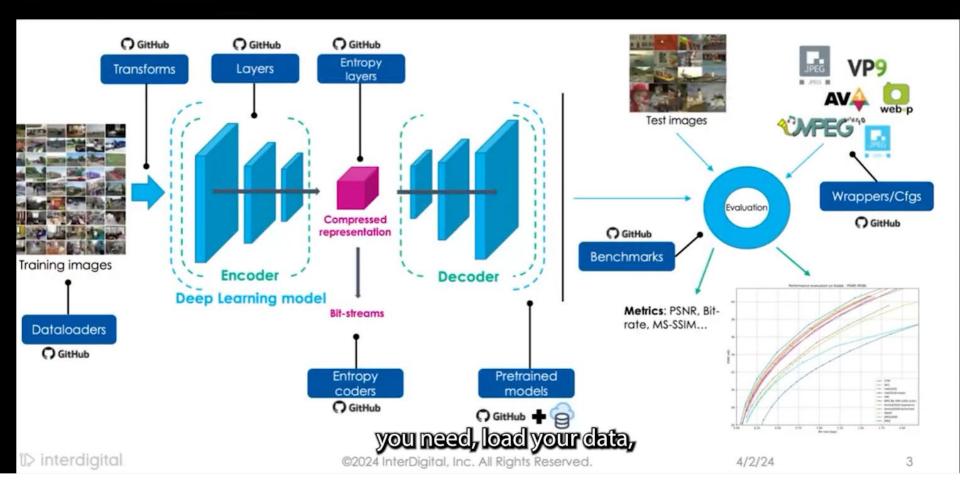
# **InterDigital Compress AI**

- What: A PyTorch library and evaluation platform for end-to-end compression research
- **Product or service:** Open source toolkit
- Exist before Al: No
- Which codecs: Agnostic
- CompressAl currently provides:
  - Custom operations, layers and models for deeplearning-basedd data compression
  - A partial port of the official <u>TensorFlow</u> <u>compression</u> library
  - Pre-trained end-to-end compression models for learned image compression
  - Evaluation scripts to compare learned models against classical image/video compression codecs



- For more information:
- Download from Github
- For more
  - Interview video: https://youtu.be/nn9TGr\_T8kY

# ¡₯ compressAI



### ິ່ງ compressAl

compressAl enables researchers to quickly design, train, test and evaluate Al-based codecs.

https://github.com/Inter DigitalInc/CompressAl



#### compressAl provides:

- A Pytorch library (compression modules: entropy bottlenecks, entropy coders) to simplify and accelerate Albased video compression research
- An evaluation platform for apples-toapples comparison of your compression model with state-of-theart traditional and Al-based codecs.

## **Interra - Baton Captions**



- What: Content-Aware Captioning & Subtitling
- **Product or service:** Product
- Al Source: mix of open-source and home grown
- Exist before AI: Yes
- **Benefit of Al:** Faster, better, more features
- Bold claim: Deploys AI multiple components: speech to text technology, natural language processing, speaker identification, scene change detection, burnt-in text detection, face detection, and machine translation.

#### For more information:

- Website: <u>www.interrasystems.com/BATON-Captions.php</u>
- Interview video: <a href="https://youtu.be/dp00ah190No">https://youtu.be/dp00ah190No</a>

# **Interra Captions**

#### **Natural Language Processing**



Others
(Character count only)

They call Errol Spence "The Truth," and

over the course of a steady rise the undefeated "28-year-old" has earned his

nickname and a world title...



BATON Captions
(Intelligent Segmentation)

They call Errol Spence "The Truth," and over the course of a steady rise

the undefeated "28 year old" has earned his nickname

and a world title...

NLP delivers captions that read more naturally and are easier to understand

**Understands writer intent and sentiment** 

#### **IMAX Viewer Score**

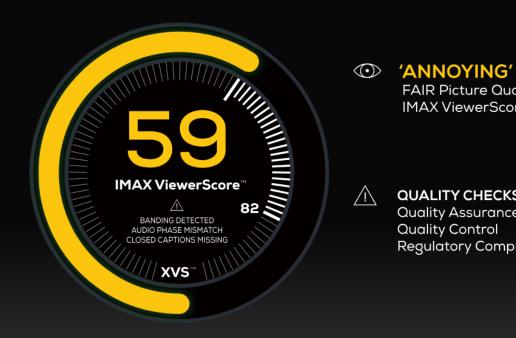
- What: No reference real time video metric (formerly SSIMPLUS)
- **Product or service:** Product
  - StreamAware real-time quality monitoring and reporting
  - StreamSmart dynamically adjusts stream quality
- Exist before AI: Yes
- Benefit of AI: More accurately matches human perception (up to 94% from 90%)



- **Bold claim:** Optimize encoding to reduce bitrate by 15% or more?
- Which codecs: Agnostic
- For more information
  - https://www.imax.com/sct
  - interview https://youtu.be/q6VdxaL651E

Sees like a subscriber and a studio expert.

**Knows exactly** when quality and compliance is lost, and why.



**FAIR Picture Quality** 

**QUALITY CHECKS: Quality Assurance** 

**Regulatory Compliance** 

**Quality Control** 

IMAX ViewerScore: 59

0-100 scoring (same as VMAF/SSPLUS)

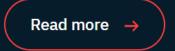
- HDR support
- Device support
- Mixed frame rate

# **Media Distillery**

- What: Al to deliver better video experiences and extended viewing time
- Product or service: Service
- Exist before AI: Yes
- Benefit of AI: Improved performance
- Bold claim: Our AI technology allows us distill topic, image, EPG correction and context from video content - all automatically and in real-time.

#### **Topic** Distillery™

Topic Distillery ™ enables topic-based discovery for any live broadcast content, allowing viewers to find content impossible to discover before and access it faster through a chapter-based playback.



#### For more information

- https://mediadistillery.com/solutions
- Interview <a href="https://youtu.be/iHqauz0rD7s">https://youtu.be/iHqauz0rD7s</a>

# **Bitmovin Analytics**

- What: Supercharging Data Insights with AI for Video Analytics
- **Product or service:** Service
- Exist before AI: Yes
- Benefit of AI: Improved usability and utility
- Implementation
  - Added to analytics service

#### Al Session Interpreter

quickly and a long startup time can lead to frustration and abandonment.

#### Quality of Experience:

The user experience was relatively good. There were no buffering events or quality changes during the playback, which means that the video played smoothly without any interruptions. The lack of pauses also indicates that the user was engaged and did not need to stop the video.

#### Quality of Service:

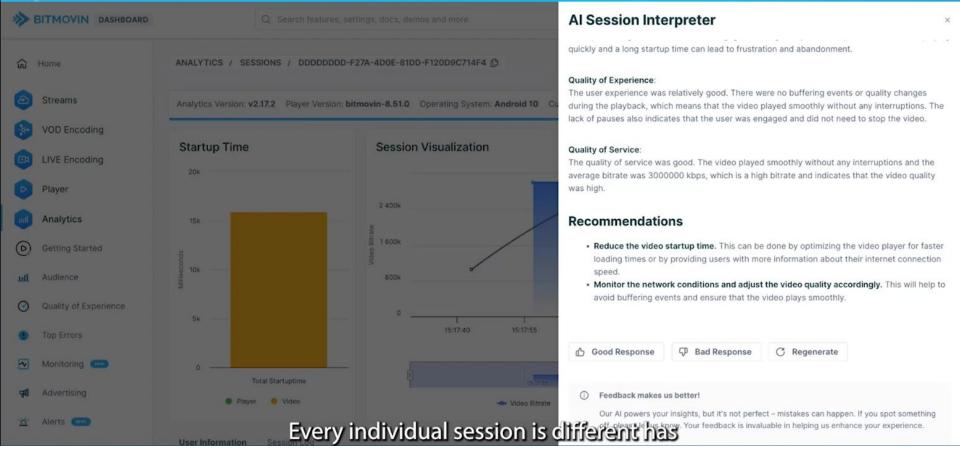
The quality of service was good. The video played smoothly without any interruptions and the average bitrate was 3000000 kbps, which is a high bitrate and indicates that the video quality was high.

#### Recommendations

- Reduce the video startup time. This can be done by optimizing the video player for faster loading times or by providing users with more information about their internet connection speed.
- Monitor the network conditions and adjust the video quality accordingly. This will help to
  avoid buffering events and ensure that the video plays smoothly.

#### For more information

https://bitmovin.com/video-analytics
 Interview - <a href="https://youtu.be/rTm26JRlkBQ">https://youtu.be/rTm26JRlkBQ</a>



# **Operative**

- What: Generative AI to automate proposal generation from texts, emails, and voice prompts
- Product or service: Service
- Exist before AI: Service yes, features no
- Benefit of AI: Intelligently speed sales tasks to optimize yield across linear and digital inventory
- Implementation
  - Added to Operative services

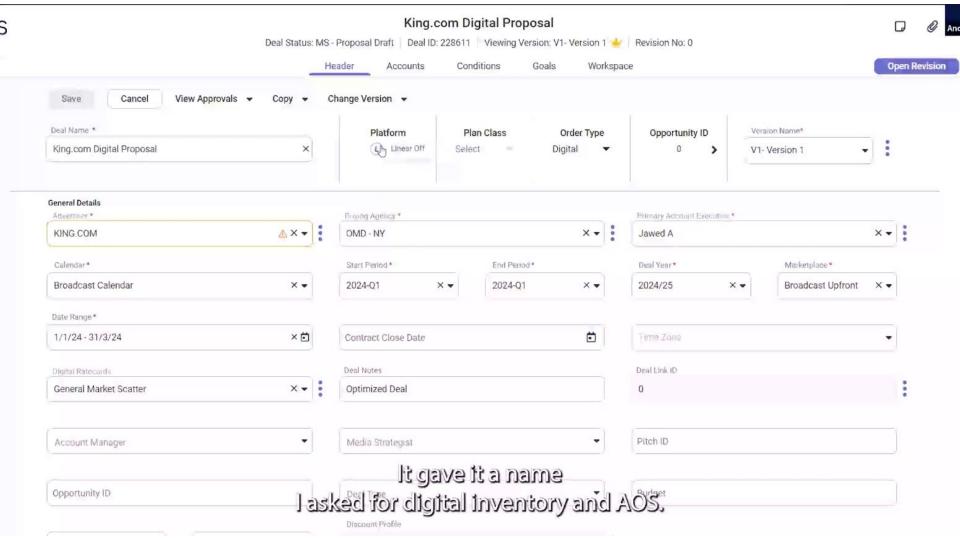






Meet Adeline, the assistive AI platform coming soon to Operative media solutions.

- To learn more:
  - https://www.operative.com/adeline/
  - Interview https://youtu.be/9JaappNDF2k



#### **AOS Landing Page**



# **Looking Ahead**

- ML integration into encoding technologies is old news
  - Harmonic, Visionular, Bitmovin have integrated AI for years
  - Most short-term benefit from pre-filtering, content adoptive, and Al integrated into codecs compatible with existing players
  - Mid term affect on specialized codec markets (video for non-humans) could be very profound
  - New Al codecs for broadcast 6+ years off
- Generative AI, in particular, could significantly enhance utility and usability of many products in the next 2-3 years
  - Al for dummies