

# Relying on a rate constraint to reduce Motion Estimation complexity

**Gabriel B. Sant'Anna, Luiz Henrique Cancellier,  
Ismael Seidel, Mateus Grellert, José Luís Güntzel**

Embedded Computing Laboratory (ECL)  
Dept. of Computer Science and Statistics (INE)  
Federal University of Santa Catarina (UFSC)  
Florianópolis, Brazil



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# Outline

- 1 Video Coding
- 2 Motion Estimation
- 3 Rate-based Candidate Elimination
- 4 Results
- 5 Conclusions

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## Video



- Video data: **75% of global internet traffic** back in 2017.  
[Cisco; *Cisco Visual Networking Index: Forecast and Trends*; 2019]

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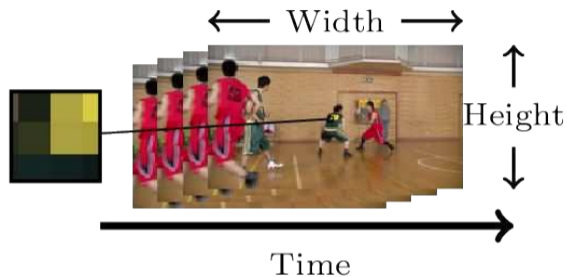
**COVID-19: worldwide increase in digital media consumption.**

[A. Watson; *Consuming media at home due to the coronavirus worldwide*; 2020]

# Compression

Example: **Full HD**

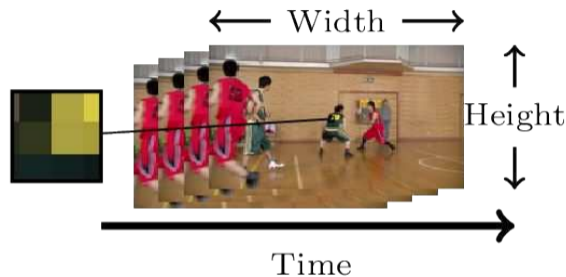
- 1920x1080 pixels/frame
- 30 frames per second
- 24 bits per pixel



# Compression

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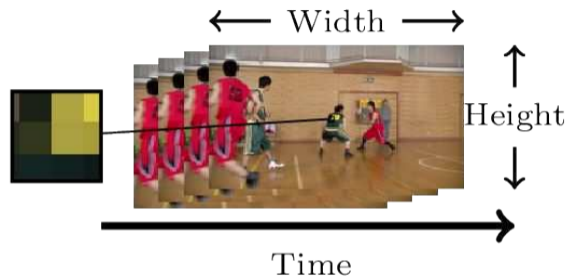


- $1920 \times 1080 \times 30 \times 24 \approx 1,5 \text{ Gb/s}$
- 1 hour of content  $\approx 672 \text{ GB}$

# Compression

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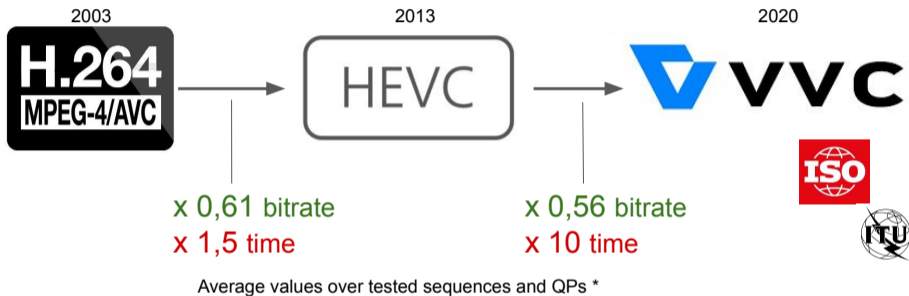


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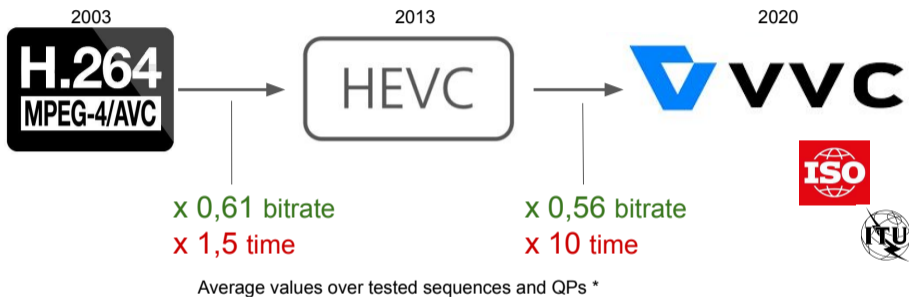


# Codecs



\* [I. Siqueira, G. Correa and M. Grellert; *Rate-Distortion and Complexity Comparison of HEVC and VVC Video Encoders*; 2019]

# Codecs



→ Goal: **Reduce encoder complexity.**

→ **Motion Estimation** algorithm.

\* [I. Siqueira, G. Correa and M. Grellert; *Rate-Distortion and Complexity Comparison of HEVC and VVC Video Encoders*; 2019]

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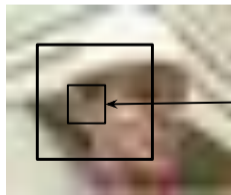
# Integer Motion Estimation

Original frame



# Integer Motion Estimation

Candidate frame

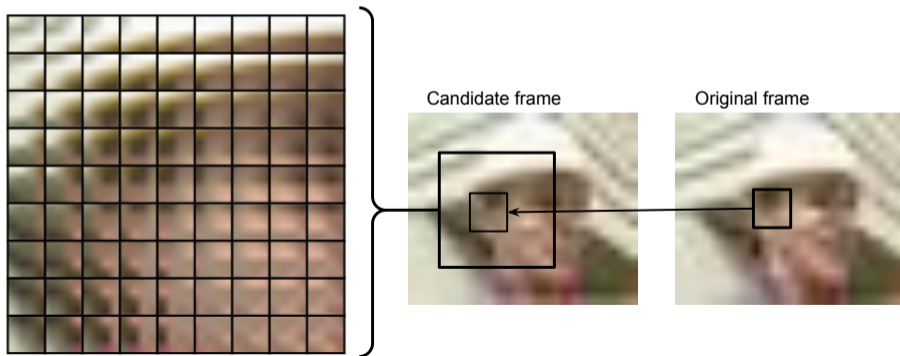


Original frame



# Integer Motion Estimation

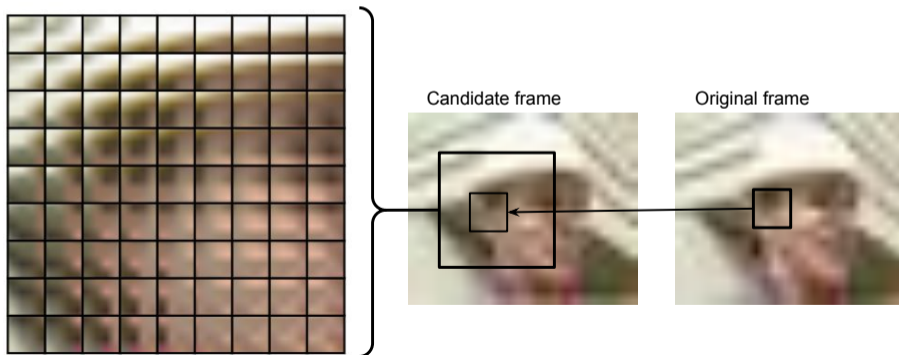
$$j(\vec{m}\vec{v}) = d(\mathbf{C}^{\vec{m}\vec{v}}) + \lambda \cdot r(\vec{m}\vec{v} - \vec{m}\vec{v}_p)$$



# Integer Motion Estimation

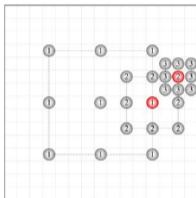
$$j(\vec{m}\vec{v}) = d(\mathbf{C}^{\vec{m}\vec{v}}) + \lambda \cdot r(\vec{m}\vec{v} - \vec{m}\vec{v}_p)$$

$$d(\mathbf{C}) = \sum_{i=1}^m \sum_{j=1}^n |\mathbf{C}_{i,j} - \mathbf{O}_{i,j}|$$

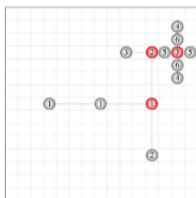


# Block-Matching Algorithms

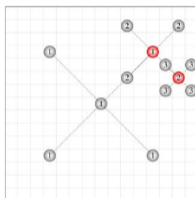
- Various search patterns developed throughout the years.



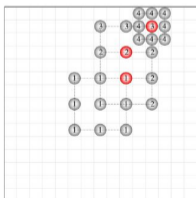
[Koga et al.; 1981]\*



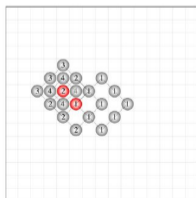
[Puri, Hang, Schilling; 1987]\*



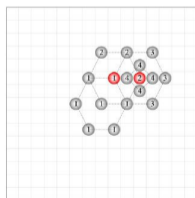
[Ghanbari; 1990]\*



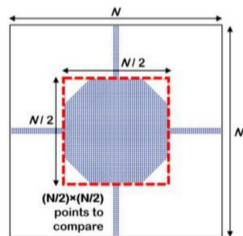
[Po and Ma; 1996]\*



[Zhu and Ma, 2000]\*



[Zhu, Lin, Chau; 2002]\*

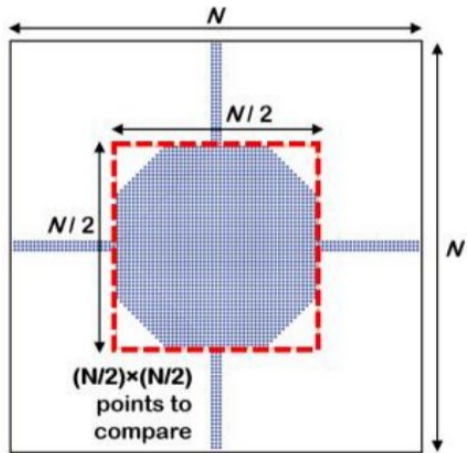


[Gonçalves et al.; 2018]

\* Figures: [Amirpour et al.; 2019]



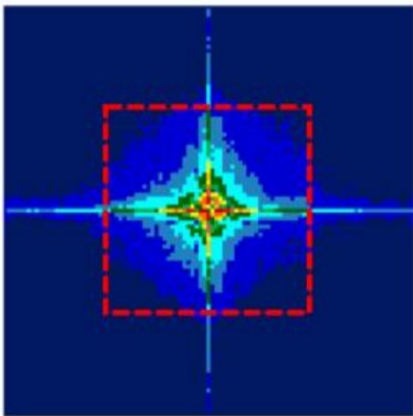
# Block-Matching Algorithms: OARP



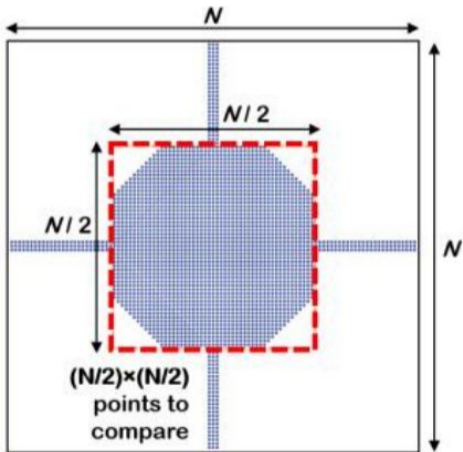
Octagonal-Axis Raster Pattern

[Gonçalves et al.; *Octagonal-Axis Raster Pattern for Improved Test Zone Search Motion Estimation*; 2018]

# Block-Matching Algorithms: OARP



Average block matching distribution



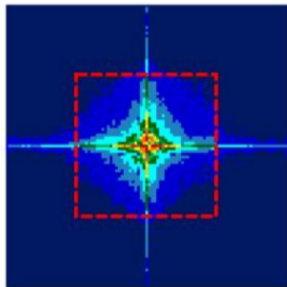
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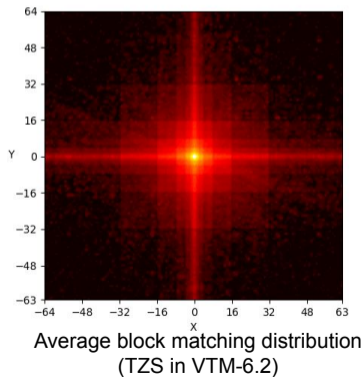
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# MV bitrate vs. decision distribution



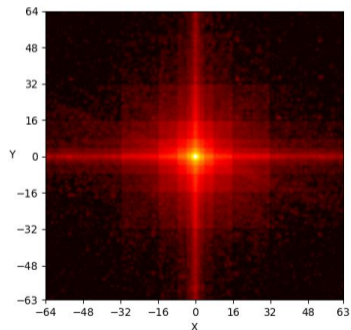
Average block matching distribution  
(TZS in HM-16.14)

# MV bitrate vs. decision distribution



# MV bitrate vs. decision distribution

$$j(\vec{m}\vec{v}) = d(\mathbf{C}^{\vec{m}\vec{v}}) + \lambda \cdot r(\vec{m}\vec{v} - \vec{m}\vec{v}_p)$$

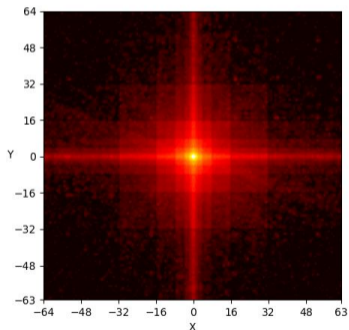


Average block matching distribution  
(TZS in VTM-6.2)

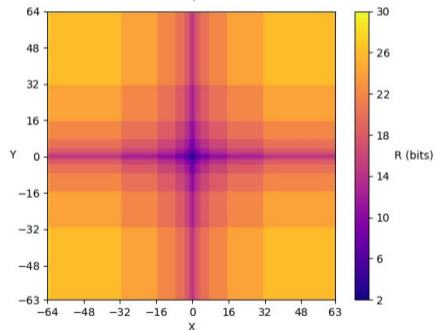
# MV bitrate vs. decision distribution

$$j(\vec{m}\vec{v}) = d(\mathbf{C}^{\vec{m}\vec{v}}) + \lambda \cdot r(\vec{m}\vec{v} - \vec{m}\vec{v}p)$$

$\rho = -0.89$



Average block matching distribution  
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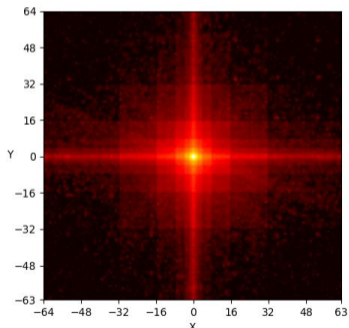


Bitrate surface

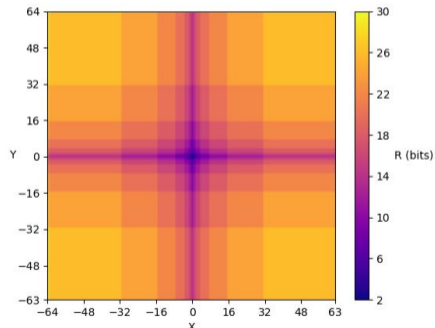
# Candidate Elimination criterion

$$j(\vec{m}\vec{v}) = d(\mathbf{C}^{\vec{m}\vec{v}}) + \lambda \cdot r(\vec{m}\vec{v} - \vec{m}\vec{v}p)$$

$$r(\vec{m}\vec{v} - \vec{m}\vec{v}p) > t$$



Average block matching distribution  
(TZS in VTM-6.2)



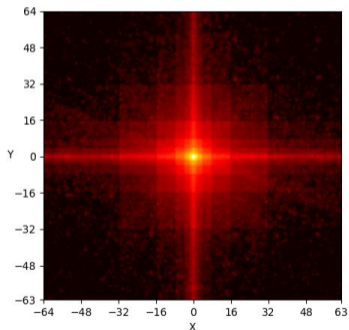
Bitrate surface



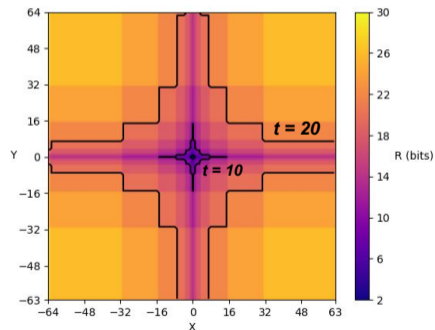
## Candidate Elimination criterion

$$j(\vec{m}v) = d(\vec{c} \times \vec{p}^{\vec{m}v}) + \lambda \cdot r(\vec{m}v - \vec{m}vp)$$

$$r(\vec{m}v - \vec{m}vp) > t$$



Average block matching distribution  
(TZS in VTM-6.2)



Bitrate surface

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# Setup

## Common Test Conditions

[Bossen et al., 2019]

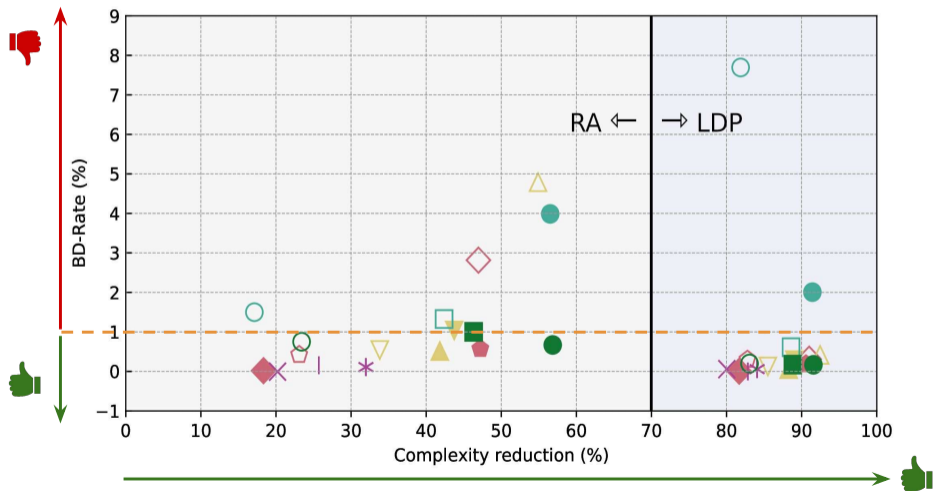
- VVC reference implementation: VTM 6.2
- 17 test sequences
- 4 QPs: { 22, 27, 32, 37 }
- 2 configurations (RA and LDP)
- Octagonal pattern replicated in VTM

→ 408 experiments



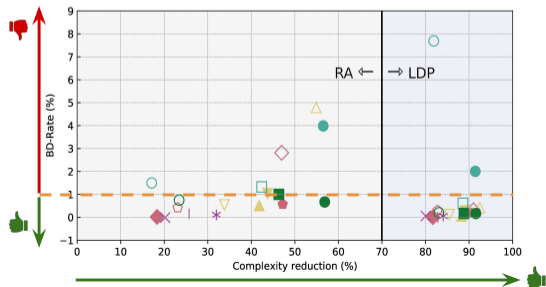
# Encoding Efficiency vs. Complexity Reduction

- Results for all tested sequences in both RA and LDP configurations.  $t = 4$



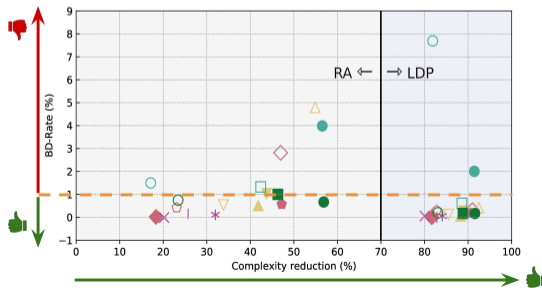
# Results - RA

- BD-Rate **over 1%** with  $t=4$



# Results - RA

- BD-Rate **over 1%** with  $t=4$
- Threshold variation



Sequence	$t = 20$		Octagonal-axis	
	BDBR	$\Delta C$	BDBR	$\Delta C$
Cactus	0.12	28.8	0.02	26.2
BballDrill	0.14	23.4	0.01	22.2
BballDrillTxt	0.09	22.9	-0.04	21.2
SlideEdit	0.63	6.8	0.03	6.1
RHorses	0.35	25.1	0.02	22.5
SShow	0.88	42.5	-0.05	36.4
RHorsesC	0.70	33.9	0.10	30.2

RA: threshold variation to limit BD-Rate increase

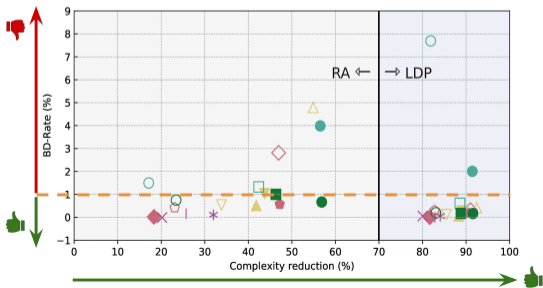
- Search region similar to that of the Octagonal-axis pattern
- Comparable quantitative results

# Results - LDP

- **86%** average complexity reduction
- 0,74% average BD-Rate
  - Under 0,5% for most sequences
  - Exceptions being **slide content videos**

Class	$t = 4$		Octagonal-axis	
	BDBR	$\Delta C$	BDBR	$\Delta C$
B	0.18	87.8	0.02	13.9
C	0.22	88.8	0.00	15.2
D	0.20	86.5	0.04	10.7
E	0.04	82.3	-0.04	6.5
F	3.44	87.3	0.37	16.4

LDP: per-class average results



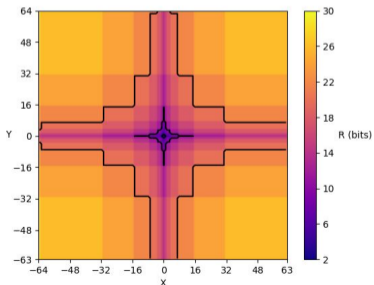
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# Conclusions

- **Flexible** candidate elimination technique: can be applied on top of existing block-matching algorithms.
- Rate threshold **can be parameterized** to suit specific applications and constraints.
- With an elimination criterion that can be very **efficiently computed**.
- Relates the precision of IME search patterns to the estimated MV bitrate cost surface.



# References

- [1] Hadi Amirpour et al. “Motion estimation with chessboard pattern prediction strategy”. In: *Multimedia Tools and Applications* 78.15 (2019), pp. 21785–21804.
- [2] F. Bossen et al. *JVET common test conditions and software reference configurations for SDR video*. Document JVET-N1010. Geneva: JVET of ITU-T, 2019. URL: [http://phenix.it-sudparis.eu/jvet/doc\\_end\\_user/current\\_document.php?id=6643](http://phenix.it-sudparis.eu/jvet/doc_end_user/current_document.php?id=6643).
- [3] Cisco. *Cisco Visual Networking Index: Forecast and Trends, 2017–2022 White Paper*. <https://web.archive.org/web/20190820234616/https://www.cisco.com/c/en/us/solutions/collateral/service-provider/visual-networking-index-vni/white-paper-c11-741490.html>. Accessed: 20 Aug. 2019. 2019.
- [4] P. Goncalves et al. “Octagonal-Axis Raster Pattern for Improved Test Zone Search Motion Estimation”. In: *2018 IEEE International Conference on Acoustics, Speech and Signal Processing (ICASSP)*. 2018, pp. 1763–1767. DOI: 10.1109/ICASSP.2018.8462580.
- [5] I. Siqueira, G. Correa, and M. Grellert. “Rate-Distortion and Complexity Comparison of HEVC and VVC Video Encoders”. In: *2020 IEEE 11th Latin American Symposium on Circuits Systems (LASCAS)*. 2020, pp. 1–4.
- [6] Amy Watson. *Consuming media at home due to the coronavirus worldwide*. <https://www.statista.com/statistics/1106498/home-media-consumption-coronavirus-worldwide-by-country/>. Accessed: 16 Jun. 2020. 2020.

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