

The Lockdown Effect

Implications of the COVID-19 Pandemic on Internet Traffic

Oliver Gasser, Max Planck Institute for Informatics

Sixth RSNOG Conference · November 26, 2020

COVID-19 and the Internet

euronews.

Coronavirus: Half of humanity now on lockdown as 90 countries call for confinement

INSIDE
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Will Shift to Remote Teaching Be Boon or Bane for Online Learning?

The New York Times

Working From Home: How Coronavirus Could Affect the Workplace

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Under lockdown, Italy's social and family life goes virtual

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The Internet is essential in all these efforts, but how well does it cope?

Lots of data

- Edge network: Large European ISP
- Core networks: 3 IXPs in Central Europe, Southern Europe, and US East Coast
- Academic network: REDIMadrid university network in Madrid

Lots of data, lots of data crunchers

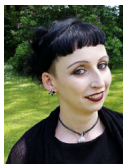
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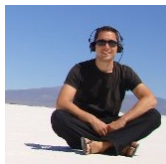
Anja Feldmann
MPII



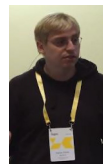
Oliver Gasser
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Ingmar Poesel
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IMDEA, ICSI



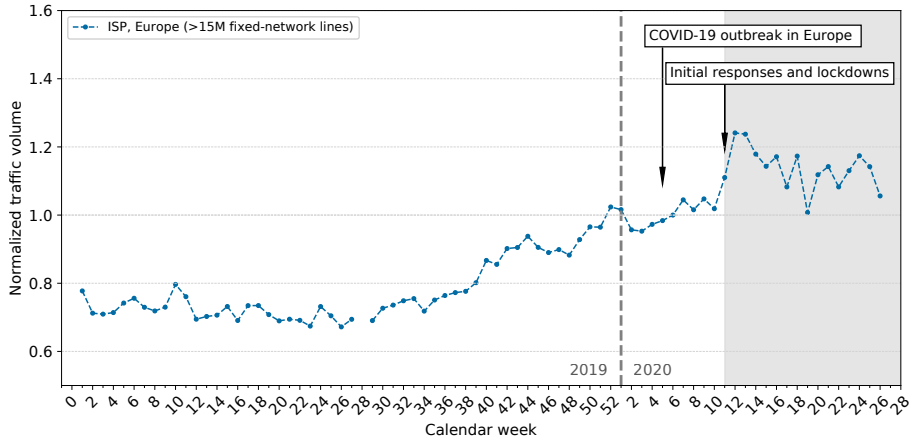
Oliver Hohfeld
Brandenburg University
of Technology



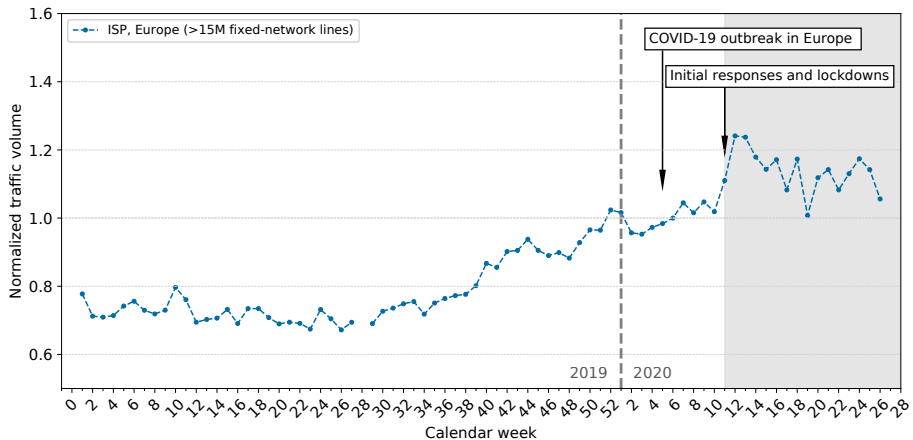
Georgios
Smaragdakis
TU Berlin, MPII

Traffic changes in different networks

Traffic changes from January 2019 to June 2020

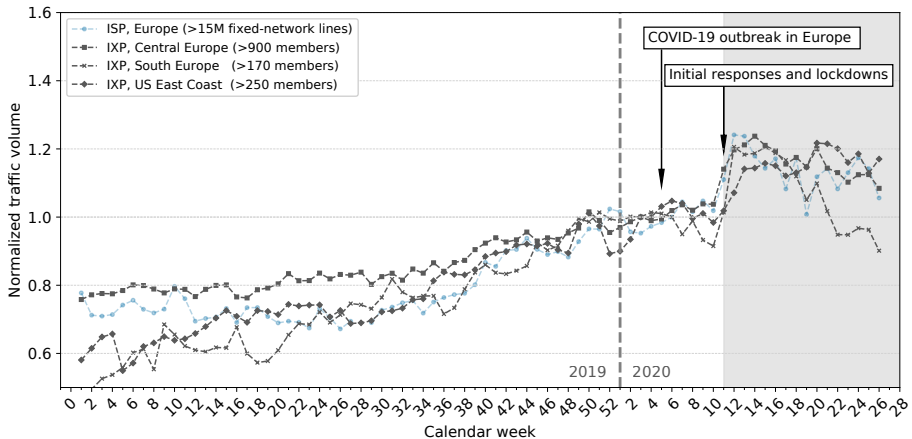


Traffic changes from January 2019 to June 2020



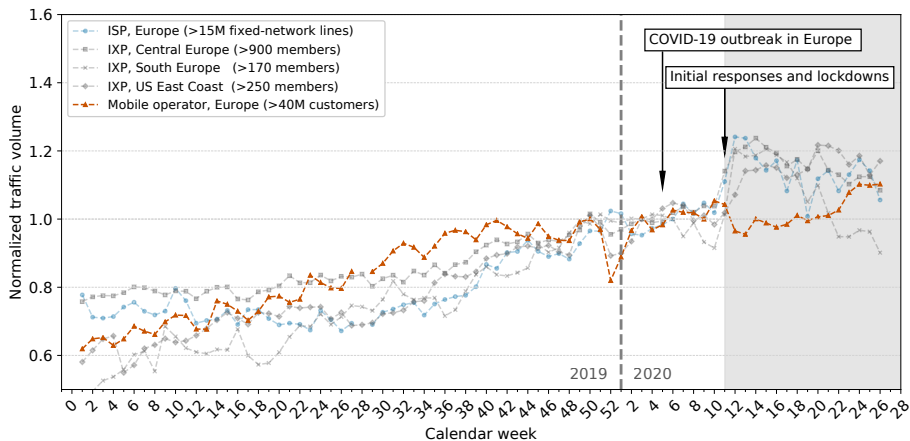
Once the lockdown started the ISP saw a +30% increase in traffic which normally spans over multiple months.

Traffic changes from January 2019 to June 2020



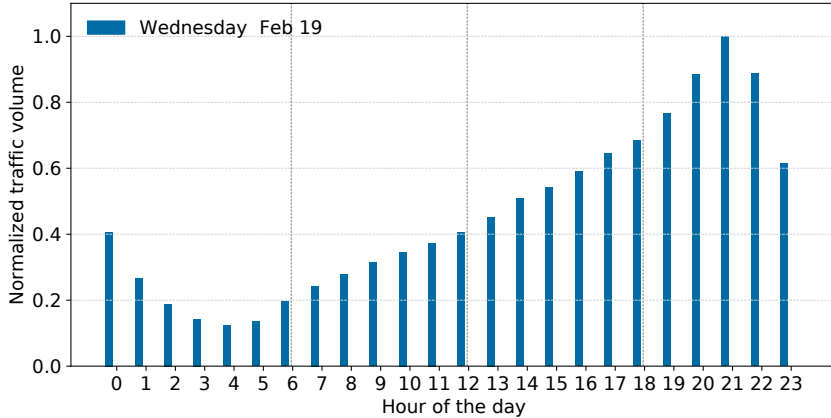
Similar behavior for the IXPs; for the IXP CE and IXP US the traffic levels remain elevated.

Traffic changes from January 2019 to June 2020



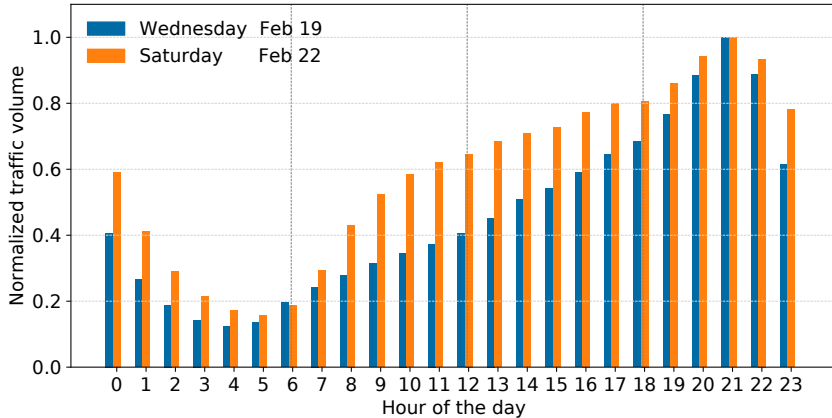
Once the lockdown started mobile traffic decreased measurably and increased again with the first relaxations in mid-April.

Changes in workday vs. weekend patterns at the ISP



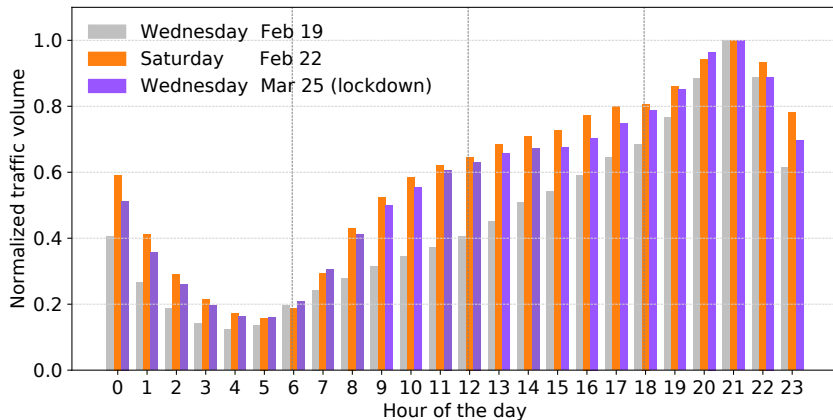
- Regular patterns
 - Workday: Strong increase in evening hours

Changes in workday vs. weekend patterns at the ISP



- Regular patterns
 - Workday: Strong increase in evening hours
 - Weekend: More traffic during daytime

Changes in workday vs. weekend patterns at the ISP



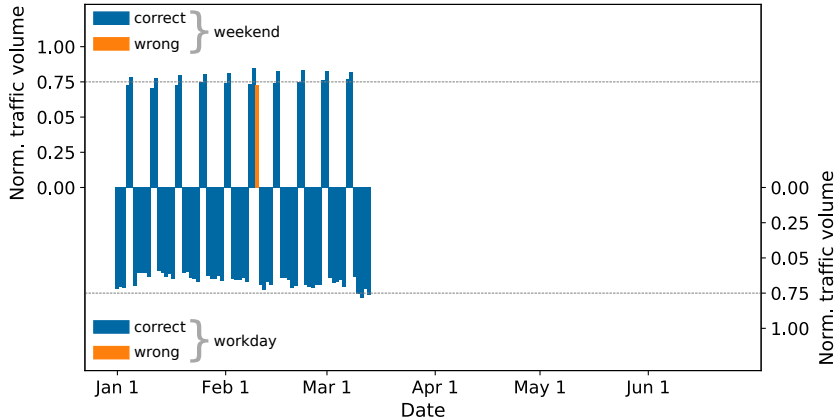
- Regular patterns
 - Workday: Strong increase in evening hours
 - Weekend: More traffic during daytime
- During lockdown: Workdays look more like weekends

Changes in workday vs. weekend patterns at the ISP



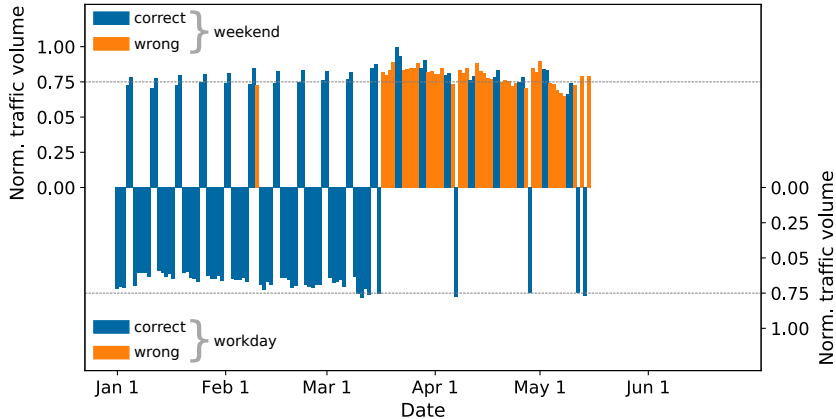
- Classify days into workdays or weekends using traffic patterns

Changes in workday vs. weekend patterns at the ISP



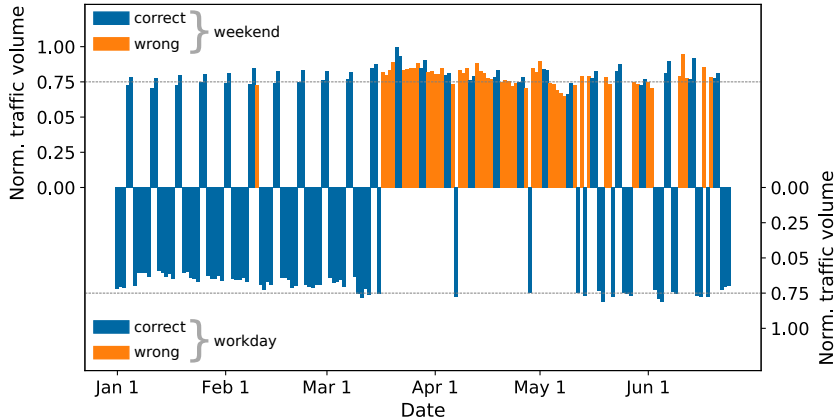
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- Pre-lockdown: Most days are classified correctly

Changes in workday vs. weekend patterns at the ISP



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- Pre-lockdown: Most days are classified correctly
- **During lockdown: Workdays are classified as weekends**

Changes in workday vs. weekend patterns at the ISP



- Classify days into workdays or weekends using traffic patterns
- Pre-lockdown: Most days are classified correctly
- During lockdown: Workdays are classified as weekends, recovering mid-May

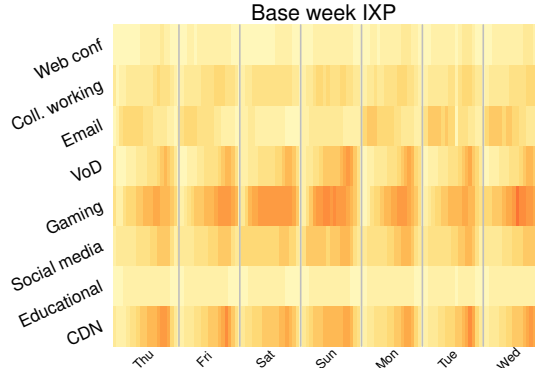
Application-level traffic changes

Classify traffic by application class

- Classify based on transport ports and src/dst ASes

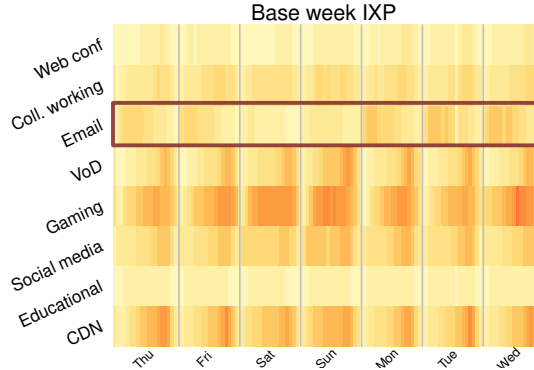
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Classify traffic by application class

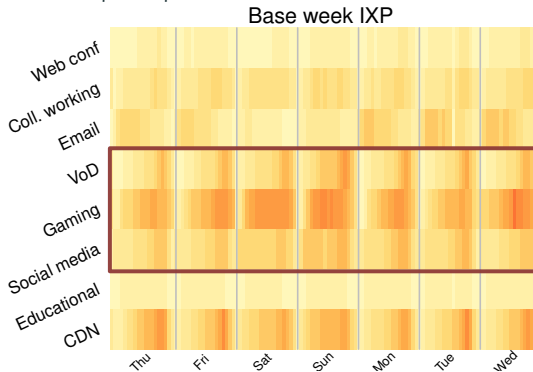
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- Email during working hours

Classify traffic by application class

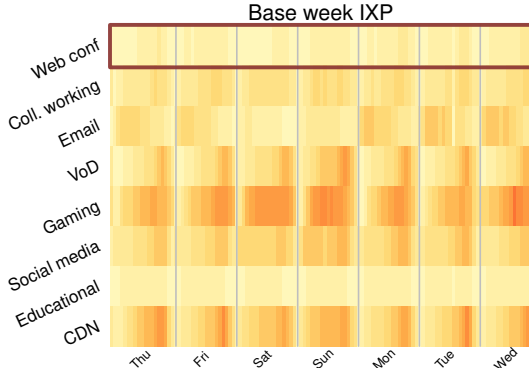
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- Email during working hours
- Video, gaming, and social media during evening hours

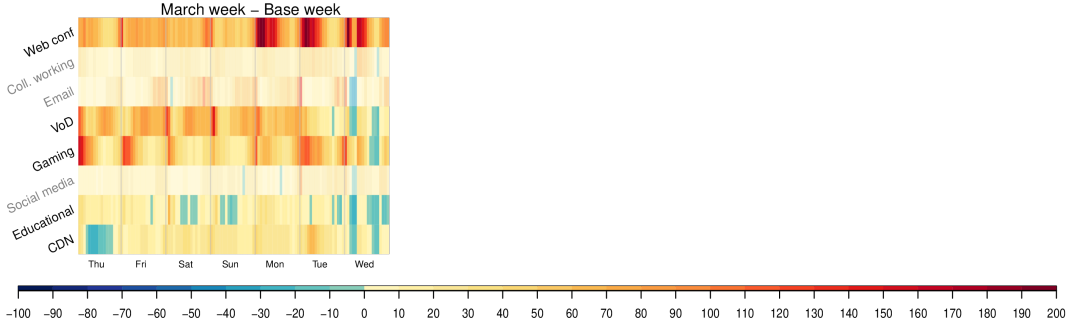
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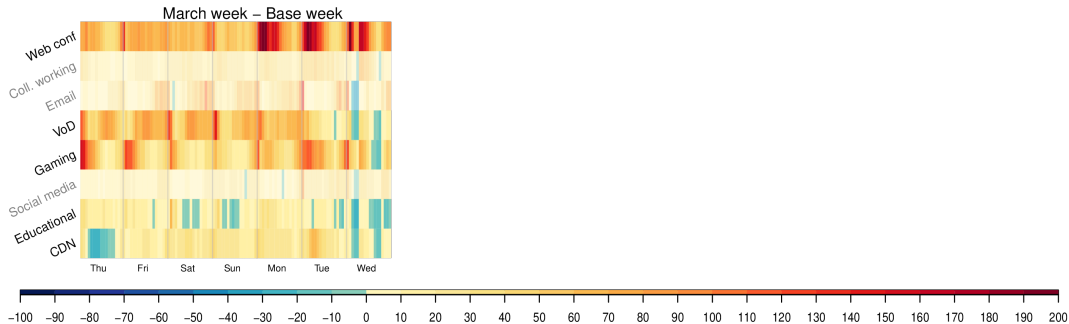


- Email during working hours
- Video, gaming, and social media during evening hours
- Hardly any web conferencing

Changes in application classes: Central European IXP



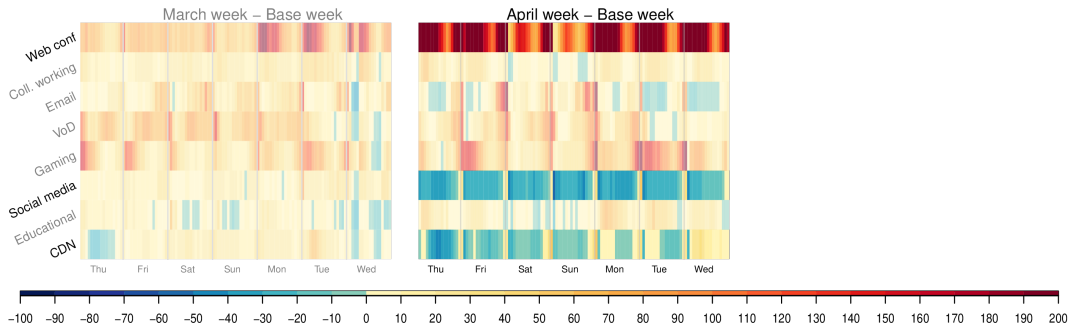
Changes in application classes: Central European IXP



March:

- Increase in web conf., VoD, and gaming
- Partial decrease in CDN and educational traffic

Changes in application classes: Central European IXP



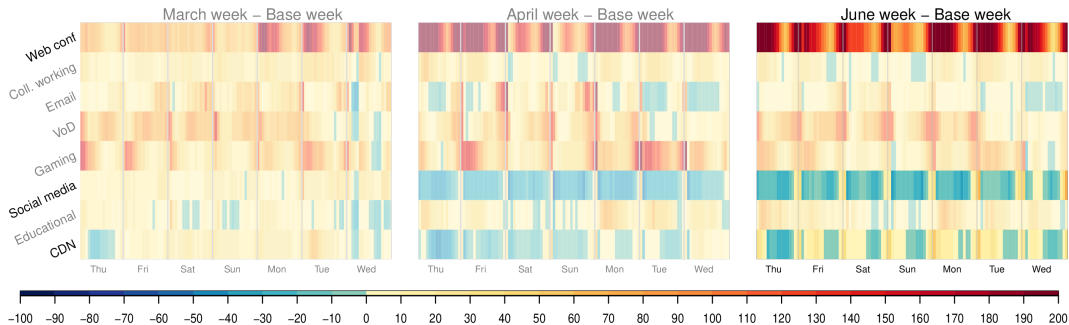
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- Strong increase in web conf.
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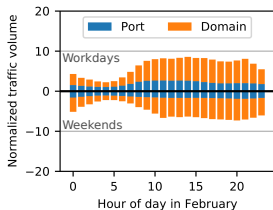
VPN identification

- Port-based: Well known port/proto combinations exclusively used by VPN services
- Domain-based: For TCP/443 traffic, IPs labeled ***vpn***, but not **www**.

VPN traffic: Central European IXP

VPN identification

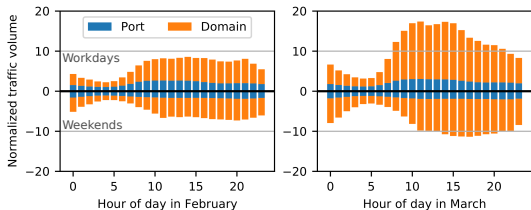
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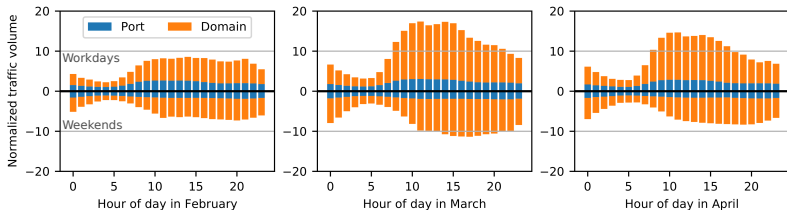


- 200% increase in VPN traffic in March during working hours

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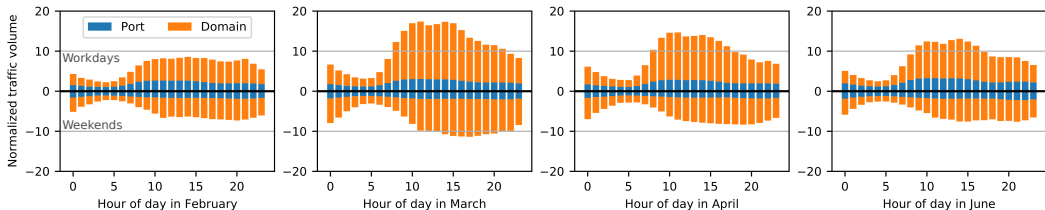


- 200% increase in VPN traffic in March during working hours
- Slight decrease in April

VPN traffic: Central European IXP

VPN identification

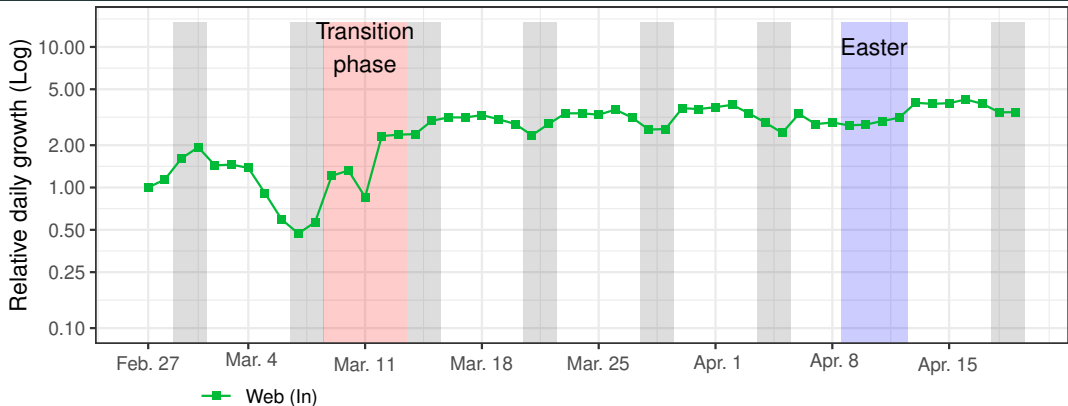
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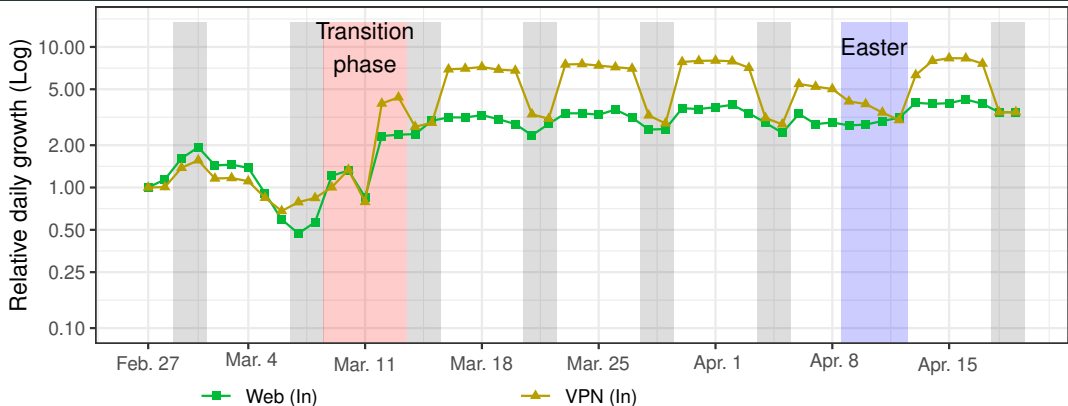
How did educational traffic change?

Daily connections for different traffic classes at REDIMadrid



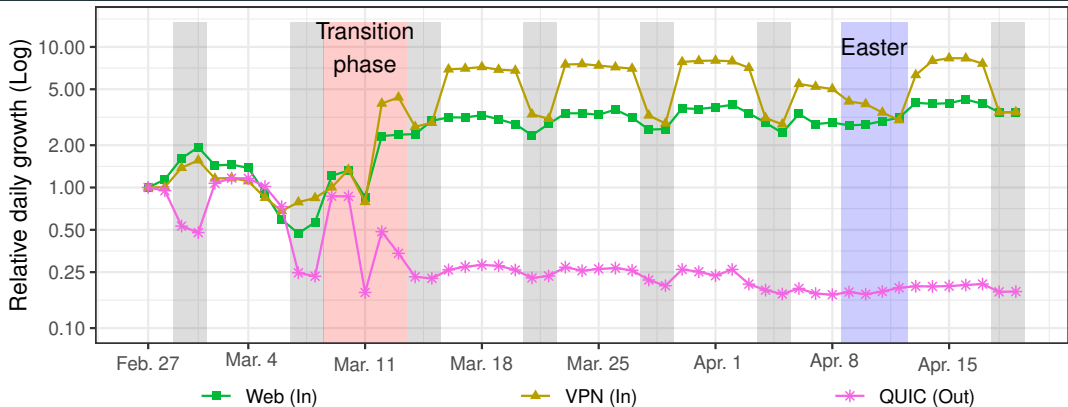
- Increase in incoming web traffic

Daily connections for different traffic classes at REDIMadrid



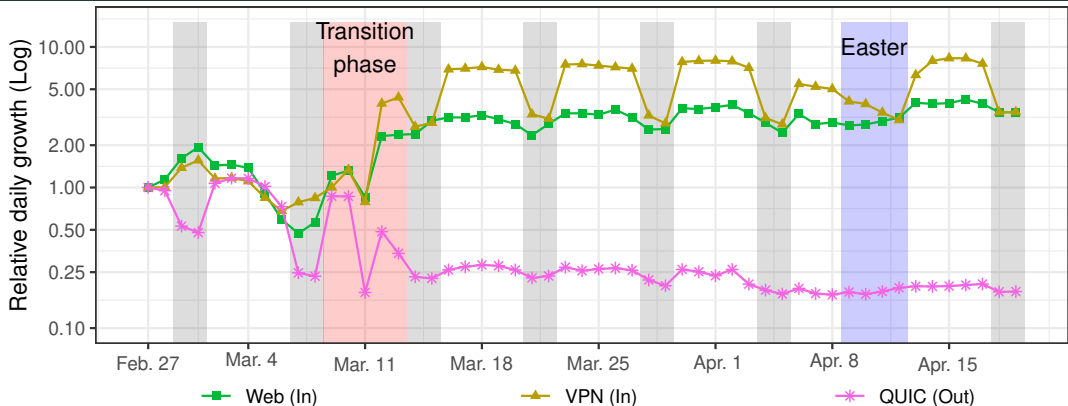
- Increase in incoming web and VPN traffic

Daily connections for different traffic classes at REDIMadrid



- Increase in incoming web and VPN traffic
- Decrease of outgoing QUIC traffic

Daily connections for different traffic classes at REDIMadrid

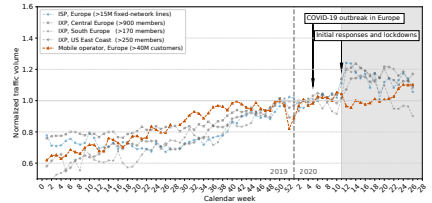


- Increase in incoming web and VPN traffic
- Decrease of outgoing QUIC traffic
- Absence of users leads to traffic decrease

What we found

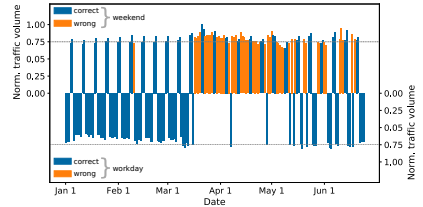
People change → traffic changes

- Traffic increase of 15-30% within a few days



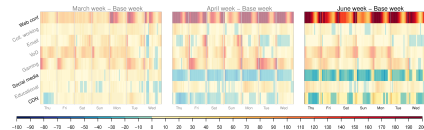
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- Traffic increase of **15-30%** within a few **days**
- **Workdays** start to look like **weekends**



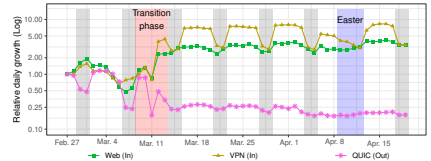
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More in our *The Lockdown Effect* IMC 2020 paper

- Changes in transport ports
- Different traffic classes
- Hypergiants vs. non-hypergiants
- ...

**The Lockdown Effect:
Implications of the COVID-19 Pandemic on Internet Traffic**


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ABSTRACT
Due to the COVID-19 pandemic, many governments imposed lockdowns that forced hundreds of millions of citizens to stay at home. The implementation of containment measures increased Internet traffic demand of residential users, in particular, for remote working, entertainment, education, and education, which, as a result, caused traffic shifts in the Internet core.

In this paper, using data from a diverse set of vantage points (over 100,000 ISPs and one metropolitan educational network), we examine the effect of these lockdowns on traffic shifts. We find that the traffic volume increased by 15-30% overall within a work-week overall shift model. This constitutes a large increase within the short time period. However, despite this surge, we observe that the Internet infrastructure is able to handle the new volume, as most traffic shifts occur outside of traditional peak hours. When looking directly at the traffic sources, it turns out that, while hypergiants still contribute a significant fraction of traffic, we see (1) a higher increase in traffic of non-hypergiants, and (2) higher increases in applications that people use at home, such as Web conferencing, VPN, and gaming. While many networks see increased traffic demands, in particular, those providing access to residential users, backbone networks experience major overall increases. Yet, in these networks, we can observe substantial increases when considering applications associated to remote working and learning.

CCS CONCEPTS
• Networks → Network measurement.

KEYWORDS
Internet Measurement, Internet Traffic, COVID-19, Traffic Shifts.

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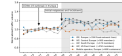


Figure 5: Traffic changes during 2020 workdays. Average point-to-point traffic averaged per week normalized by the median traffic volume of the first up to ten weeks.

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1 INTRODUCTION
The profile of a typical residential user, in terms of bandwidth usage and traffic classification, is one of the most critical parameters that network operators use to derive their network operations and infrastructure investments [24, 14]. In the last few years, user profiles have changed significantly. We observed user profile shifts from pure peer-to-peer applications to the early 2000s (e.g., file sharing) and increasing applications in 2010s (e.g., Web, TV, IPTV), and more recently, to mobile applications [24, 47]. Although changes in user profiles are a moving target, they typically have time scales of years. Thus, detecting and adapting to these movements, was feasible. The COVID-19 pandemic, in most likely a case in a generation global phenomenon that drastically changed the habits and behaviors of Internet users around the globe. As a result of the pandemic