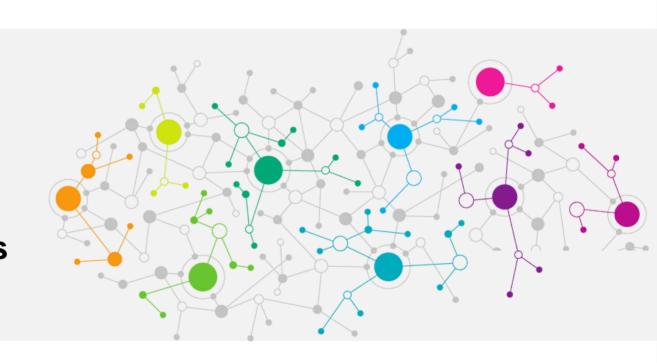


DS PT Meetup #17

A quick view on the analytical metamorphosis of a Telecom Operator





Nuno Paiva

Head of Consumer Analytics

More than 8 years working in Telecom, focusing on Marketing & Customer Value Management, and has also worked previously at Accenture as a Senior Consultant.

At the moment he leads a Data Ninjas team that are enabling NOS to make better decisions using the latest analytical artillery.

Nuno holds one MSC in Eletrotechical Engineering (University of Coimbra) and another Msc of Data Analytics (University of Porto).

Nuno Cravino

Lead Data Scientist

In his first journey into the corporate world after a few years doing learning, researching, and working inside academia and start ups as a statistician/computer scientist/database designer.

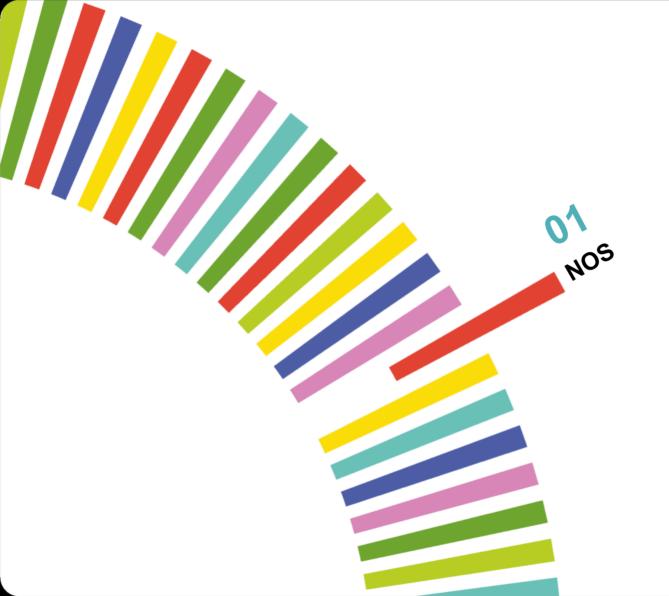
Nowadays he focus mainly in the development and operationalization of statistical/mathematical models predicting expected behavior and consumer characteristics.

Nuno holds a BSc. In Philosophy (University of Oporto), a BSc. In Computer Science (University of Oporto), and concluded post-graduated studies in Computational Statistics (Universidade Aberta).





- 1 NOS
- Analytics & the Digital Transformation
- 3 Consumer Analytics Team
- 4 How we do things





DS N

Organization





Executive Team



Miguel Almeida CEO NOS

Pelouros: Secretaria Geral | Jurídico e Regulação | Comunicação Corporativa e Sustentabilidade | Desenvolvimento Negócio e Internacional |NOS Madeira | NOS Acores



José P. Costa Vice-presidente/CFO

Pelouros: Administrativa e Financeira | Corporate Finance | Planeamento e Controlo Gestão | Auditoria Interna e Gestão de Risco | Relação Investidores | Compras| Cinemas | Audiovisuais | Publicidade



Ana Paula Marques Administradora

Pelouros: Recursos Humanos | Marca e Comunicação| Serviço ao Cliente | Logística e Gestão de Terminais| Gestão de Ativos e Serviços Gerais| Processos| Market & Customer Intelligence | NOS Luxemburgo



Luís Nascimento Administrador

Pelouros: Produto móvel e convergente| Produto Fixo| CRM| Vendas Particulares| Conteúdos



Manuel Ramalho Eanes Administrador

Pelouros: Corporate|
|Vendas Grandes
Empresas| Vendas PME|
Soluções Empresariais|
Marketing Empresas| IT
Service Management|
Wholesale| Informação
Empresas&Operadores



Jorge Graça
Administrador

Pelouros: Engenharia e Desenvolvimento de Rede e Infraestruturas| Plataformas de Serviço| Data Center| Operação e Supervisão| Sistemas de Informação | Desenvolvimento de Produto



Main Figures (3rdT 2016)





An Inclusive Brand









Innovation in its DNA

1. Smart TV



UMA is the 1st TV
 European product with deep personalization experience, available on multi-screen with voice control/app interaction.

2. Augmented Reality



1st Operator em
 Portugal to deliver TV
 Contents in Augmented
 Reality through
 Hololens & NOS TV App

3. Innovation Awards



 Awards top innovation projects providing visibility and network opportunities.

DS N

Awards

































Iris

Iris Online

NOS Cinco





NOS Quatro Light

Cine Top

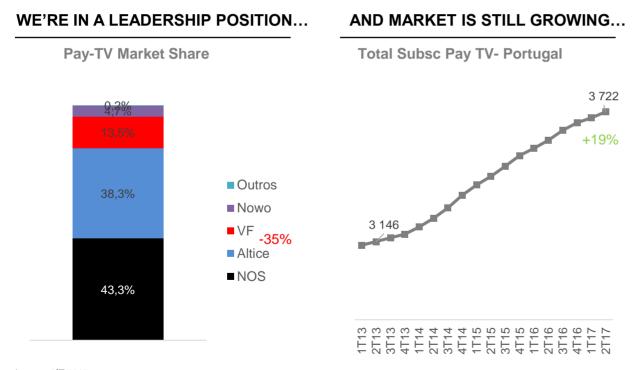






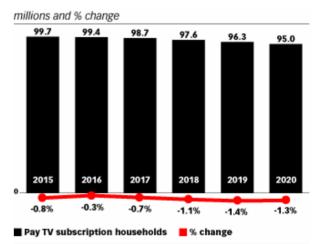
PORTUGUESE MARKET

Although we're leaders in TV, and market is still growing, with the digital revolution there are challenges ahead.



BUT HOW IT'LL EVOLVE?

US Pay TV Households 2015-2020



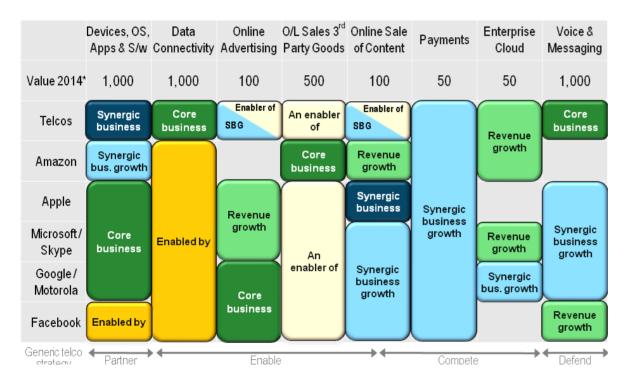
Note: payTV households are those with a subscription to traditional payTV services; excludes IPTV and pure-play online video services (e.g., Hulu, Netflix, SlingTV, YouTube, etc.)
Source: eMarketer. Ian 2017

764 www.eMarketer.com



"THE GREAT GAME - POSITIONS, ROLES &

Slocka Telegih Etsir role in the Digital value chain, data monetization is one way...





Fonte: http://www.telco2.net/blog/



POSSIBLE GROWTH APPROACHES

For any growth option it's easy to find out opportunities that will be fueled by analytics.

 "Improved segmentation (potentially using analytics to enable price discrimination)"

1 Connectivity

- Subscriber growth
- ARPU growth
- Connectivity for IoT

2 Extensions to core services

- TV/video content (AT&T)
- · Smart home (SK Telecom)

 "Decreasing churn by bundling services, notably by associating higher churn services with lower churn ones"

 Precision marketing insights is a sophisticated Data Product that helps businesses to understand target audiences.

New opportunities

- Security (Singtel)
- Advertising (Verizon)
- IoT beyond connectivity (Vodafone)

4 Venture capital investments

- Seed funds (Telefónica)
- Early stage venture capital investments (Verizon)

THE ANALYTICAL METAMORPHOSIS

Ilustrativo

The competitive arena is very dynamic and it overlaps with full digital players, digital transformation is imperative to keep



- Small Data paradigm:
- Business low level of digitalization;
- Inexistence of a centralized structure of information governance.
- Big Data strategies start developing;
- Advanced analytics being applied in a few functions to otimize opportunistic use cases.
- infrastructure and data lake available:
- Industrialisation of aanalytics capabilities;
- Dissemination of a sophisticated analytical culture.

- embeded on business processes:
- New businesses enabled by data/analytics:
- Partnerships/acquisition s in analytics domain.







NOS GOALS



Consumer Analytics Team

WHY WE DO WHAT WE DO?





negócio.

Consumer Analytics Team

N S

WHAT'S COOL ABOUT ANALYTICS AT NOS?

1 Analytical DNA

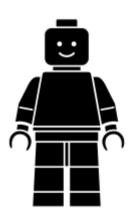
2 We've (Super Interesting) Data!

3 We've the Toys!



Nos Stock Trend





- Our performance and result delivery is based on a strong analytical Culture.

 Data is a strategical asset which we curate and nurture; technology that the challenge of the chal
 - We've a full stack of fresh Big Data technologies to tackle all data challenges.

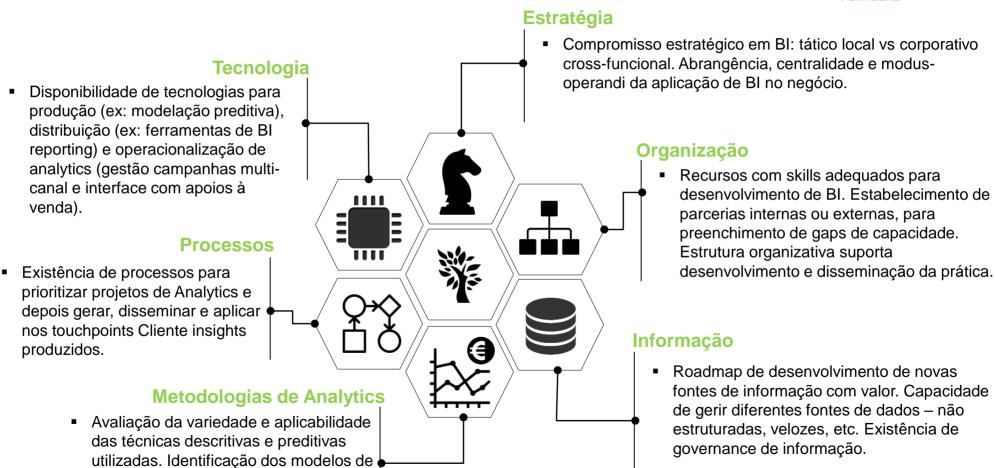
avaliação financeira dos projetos de

Analytics.

Consumer Analytics

HOW CAN WE PLAN AND BUILD A BETTER ANALYTICS PRACTICE?



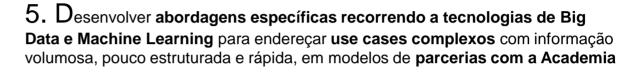


Consumer Analytics

HOW WE'RE ORGANIZED?









4. Compreender a base de Clientes, prescrever ações/produtos, resolver problemas de otimização criando impacto no negócio, de forma industrializada, com apoio em técnicas mainstream de analytics.



3. Acelerar operações de angariação, x-sell/upsell e retenção através de iniciativas proximidade analítica - dashboarding e agilidade na análise e recomendação;



2. Garantir produção de informação estruturada para consumo dos end users e estabelecer plano para incluir novas fontes de informação com potencial de monetização.



1. Estabelecer roadmap de evolução da arquitetura que promova o selfservice/agilidade dos utilizadores, gerir as plataformas garantindo uma operação fluída em todo o stack - implementar políticas de segurança, gestão de acessos, quotas, updates, monitorização de performance, etc.

THERE'RE OPPORTUNITIES EVERYWHERE!



Ilustrativo

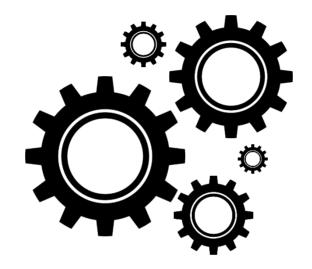






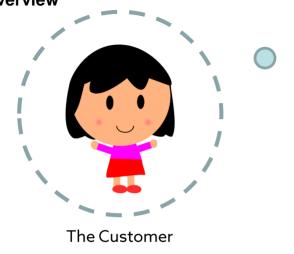


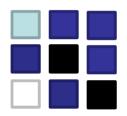
The Consumer Analytics Machine

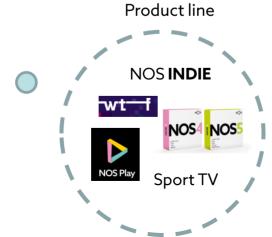


A.K.A. what do we do all day...

DS PT - A quick view on the analytical metamorphosis of a Telecom Operator CRM Overview











Communication Channels

Data Sources



Network Ops

ΙT

Innovation

Logistics

CRM

Sales

Product

Data Sources



Network Ops

ΙT

Innovation

Logistics

CRM

Sales

Product

DS PT - A quick view on the analytical metamorphosis of a Telecom Operator CRM Overview

Infrastructure





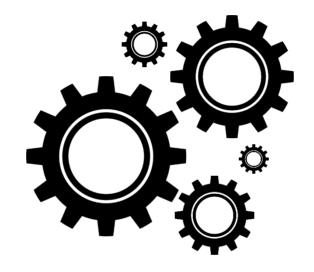


CRM



DS PT - A quick view on the analytical metamorphosis of a Telecom Operator Analytical Problems at NOS

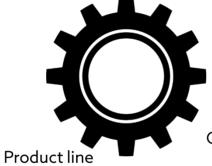












Propensity Modeling

Or how to use machine learning to drive campaigns & sales!



DS PT - A quick view on the analytical metamorphosis of a Telecom Operator

Propensity Modeling

Data

Model

Modeling



Interactions

Costumer Profile

Aggregated Service Data



Propensity Modeling

Modeling

Data

Costumer Profile & Interactions

> Aggregated Service Data

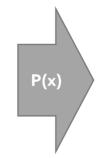




Regularized Linear Models
Random Forests
Boosted Linear Models
Boosted Tree Models
Neural Networks

. .



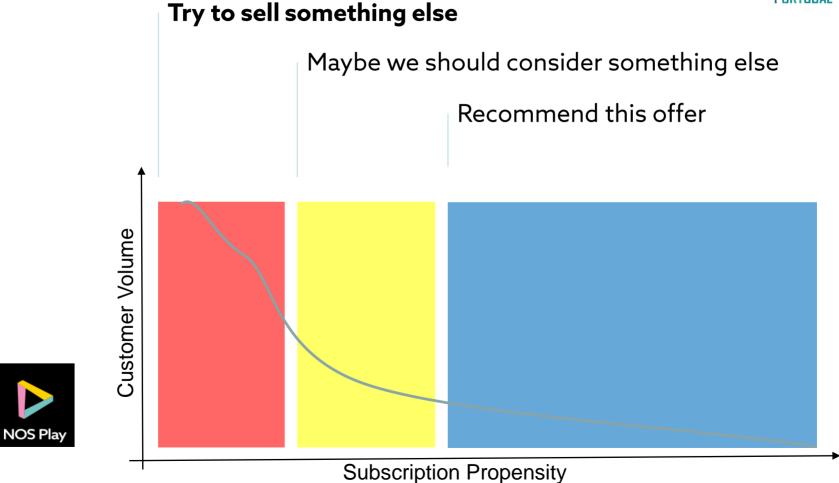


Service
Subscription
Propensity
Based on
Historical Data

Propensity Modeling

Propensity Decomposition





DS PT - A quick view on the analytical metamorphosis of a Telecom Operator

Propensity Modeling

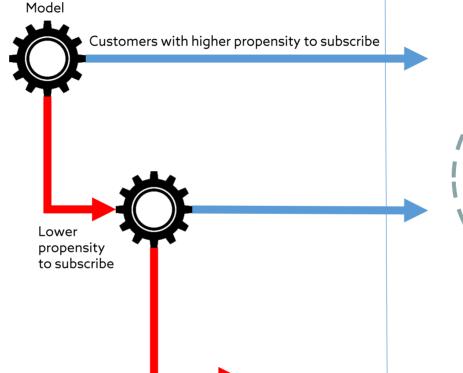
Data

Costumer Profile & Interactions

> Aggregated Service Data



Campaigns & Sales



Modeling



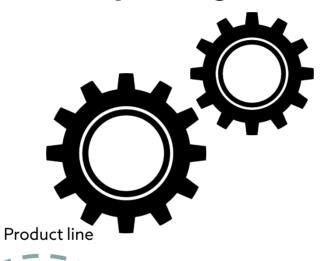
Channels

Improving Call Center Efficiency





Improving Call Center Efficiency







Communication Channels

Operations Research meets Machine learning

Improving Call Center Efficiency





Find the best time to call...



...but keep the operators always busy.

DS PT - A quick view on the analytical metamorphosis of a Telecom Operator

Improving Call Center Efficiency

Data

Past Attempts

Aggregated Service Data

Modeling

Best time to call Model





Improving Call Center Efficiency

Best time to call Model

Data

Past Attempts

Aggregated Service Data



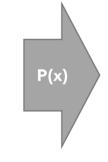
Modeling

Best time to call Model



Regularized Linear Models

One per each hour



Hourly probability of picking up the phone

DS PT - A quick view on the analytical metamorphosis of a Telecom Operator

Improving Call Center Efficiency





Aggregated Service Data

Modeling

Best time to call Model



Hourly Probability of Taking a call

Operation Optimization Model





Improving Call Center Efficiency

Operation Optimization Model

Data

Past Attempts

Aggregated Service Data



Modeling

Operation Optimization Model



Allocation model
Many operational restrictions
Optimizes a call pick up index



Optimal Allocation schedule to call the costumers

Improving Call Center Efficiency

Data

Past Attempts

Aggregated Service Data

Modeling

Best time to call Model



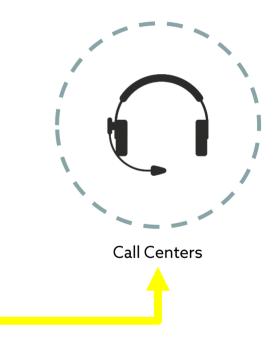
Hourly Probability of Taking a call

Operation Optimization Model





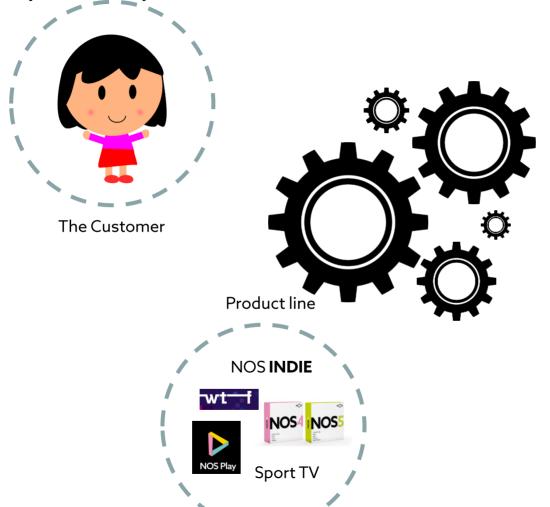
Costumer Contact



Optimized calling schedule

DS PT - A quick view on the analytical metamorphosis of a Telecom Operator

Other Analytical Developments







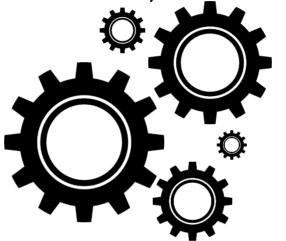
Communication Channels

Other Analytical Developments

Plenty of problems to solve!



Improving Call Center Efficiency



Propensity Modeling

Improving Service Quality

Churn Prevention

Customer Segmentation & Profiling

New Products and Bundles

DS PT - A quick view on the analytical metamorphosis of a Telecom Operator ${\bf Q\&A}$







HELP US TO IMPROVE!

#Q	Questão
Q1	Em que medida considera que os conteúdos da apresentação foram adequados a cadeira de seminário?
Q2	Em que medida o desempenho do formador contribuiu para a compreensão dos conteúdos?
Q3	Em que medida a qualidade técnica do apresentador contribuiu para a formação?
Q4	Considera que esta apresentação teve impacto ao nível do seu desempenho em equipa dentro da organização onde trabalha?
Q5	Considera que esta apresentação pode ser útil na progressão da sua carreira?
Q6	Considera que esta apresentação foi útil para o seu desenvolvimento pessoal?
Q7	Recomendaria esta apresentação a outras pessoas?
Q8	De que forma contribuiu o conteúdo do documento de apresentação para a aprendizagem?



https://www.surveymonkey.com/r/33QP6BX

THANK YOU!