

Applying Analytics on Critical Processes

“Predicting patient inflow for emergency care”

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Atos Netherlands

Trusted partner for your Digital Journey

Atos

Atos Overview

5 IT service company in the world, # 1 in Europe

Revenue
(EUR)
13bn

Employees (Global)
110,000

Countries
73

**“Our vision for the future:
to accelerate progress by
uniting people, business
and technology.”**

SIEMENS

Strategic Alliance
R&D budget increase to €330m



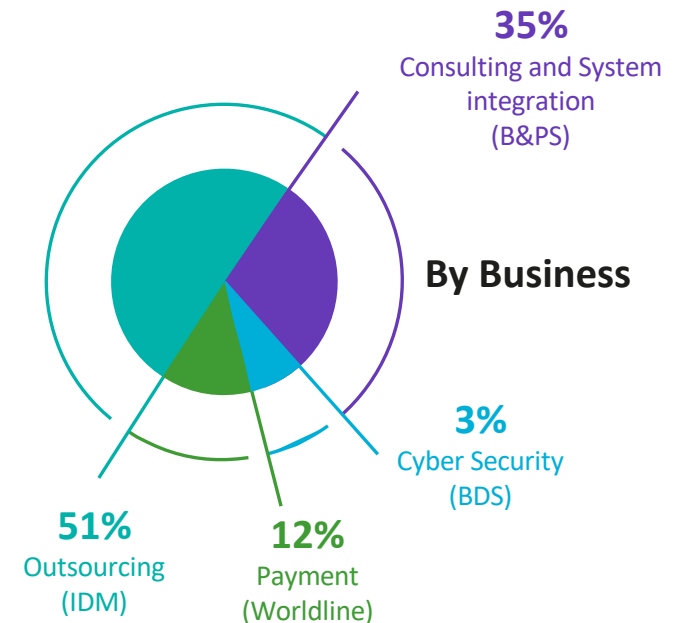
Global Partnership
Global partnership in data analytics and cloud



Strategic Global Partnership
Secure hybrid Cloud and data analytics.
Atos to create three R&D centers and Innovation
Labs in Europe and North America to focus on AI
& ML

Atos **acquired companies** over past 2 years:

- **Digital River**
- **Pursuit Healthcare Advisors** (vertical)
- **Conduent Breakaway Group** (vertical)
- **Siemens Convergence Creators**
- **zData** (analytics)
- **Equens**
- **InfoPartners** (vertical)
- **EngageESM**
- **Anthelio** (vertical & analytics)



Think global, act local

9,500
UK & Ireland

6,000
Iberia

14,500
France

12,500
North American Ops

3,000
South America

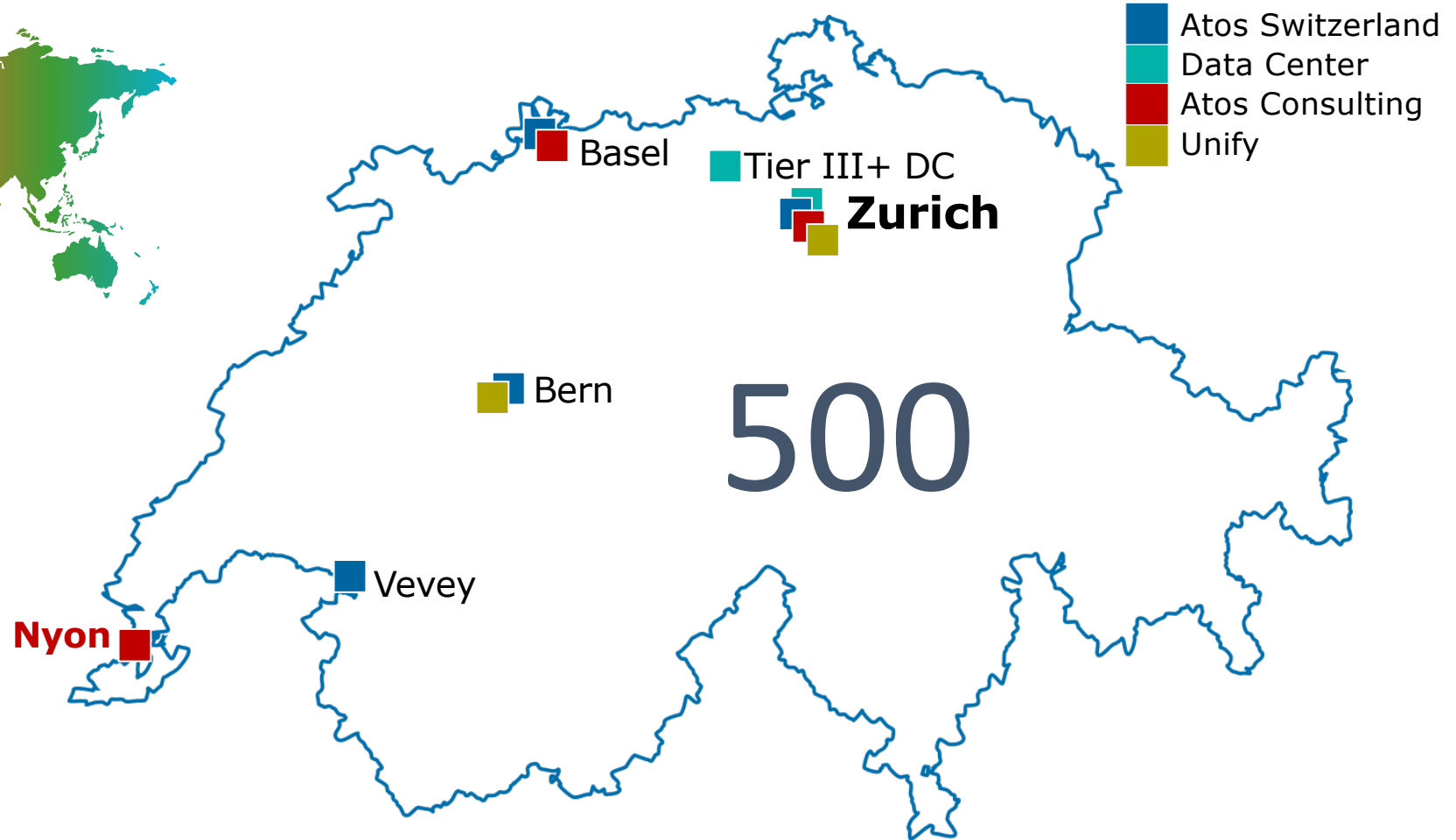
13,000
Benelux & The Nordics

9,500
Central & Eastern Europe

11,000
Germany

39,000
Asia Pacific

2,500
Middle East & Africa



Introduction

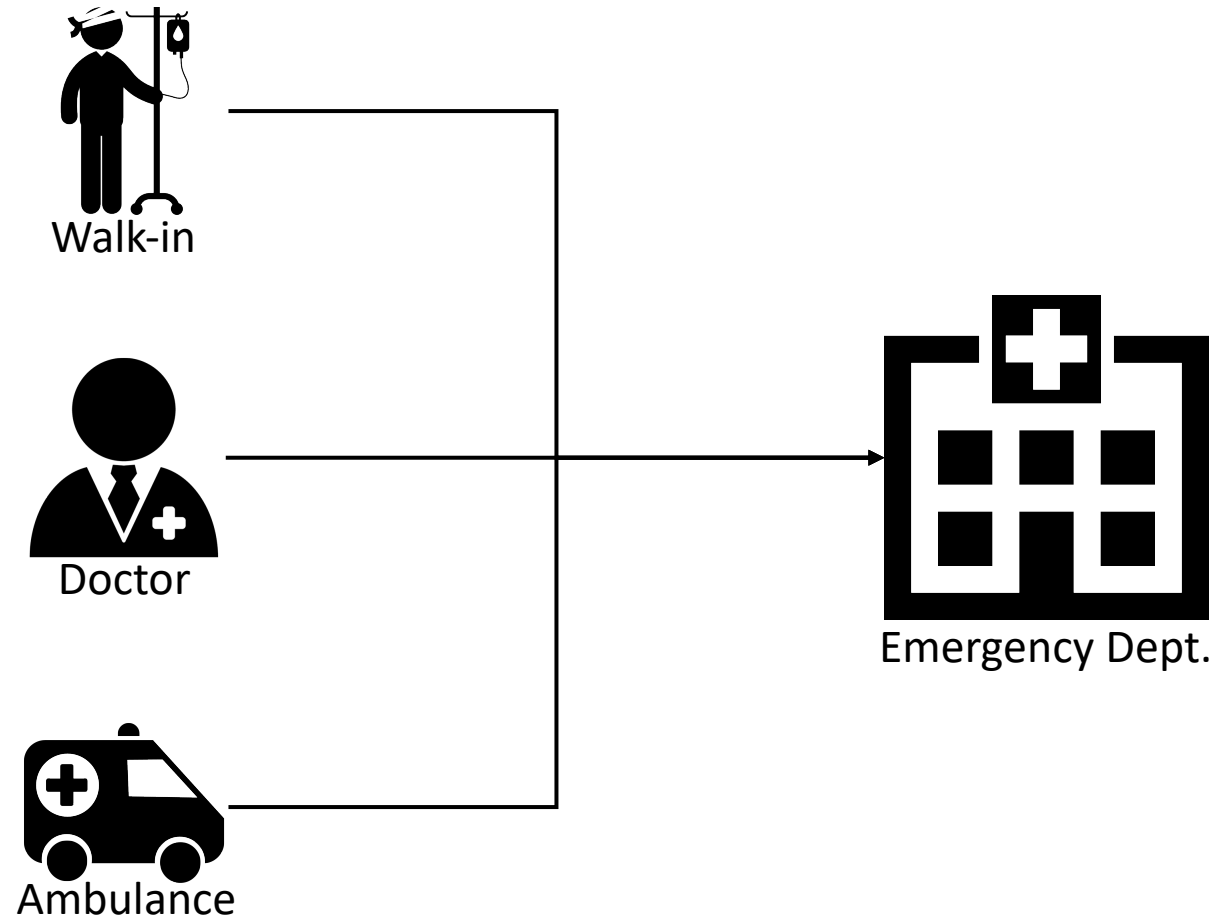


- The emergency departments (ED) in hospitals are dedicated to people who need immediate medical care and can be visited on any day at any time
 - In the Netherlands over **1,000,000 people** visited EDs yearly since 2013 (source: LIS)
 - This number is rising due to population increase and population aging
 - Especially ambulance usage is increasing for critical care patients
- However budget cuts and a reduction in qualified personnel are leading to problems in providing consistent care and pose a future threat
- Data Analytics and Machine Learning could help remedy the situation

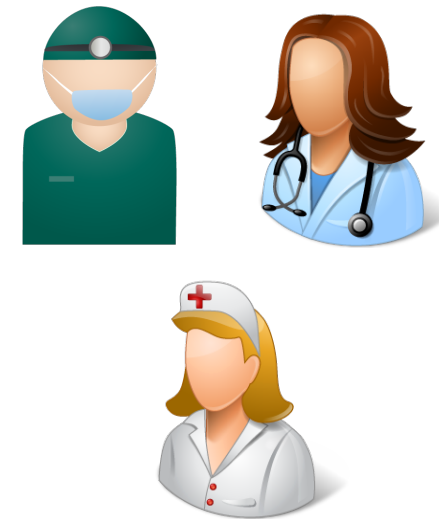
Current Situation in a Single Hospital

Inflow Type

Can we use a data-driven approach to streamline parts this process?



Emergency Dept. Team

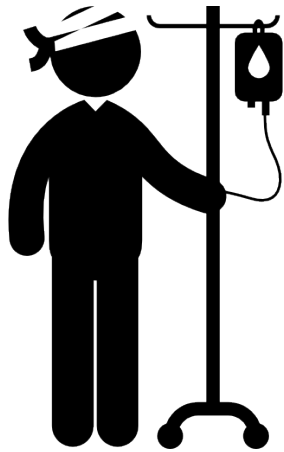


Nurses and doctors are evenly planned over the week in three daily shifts

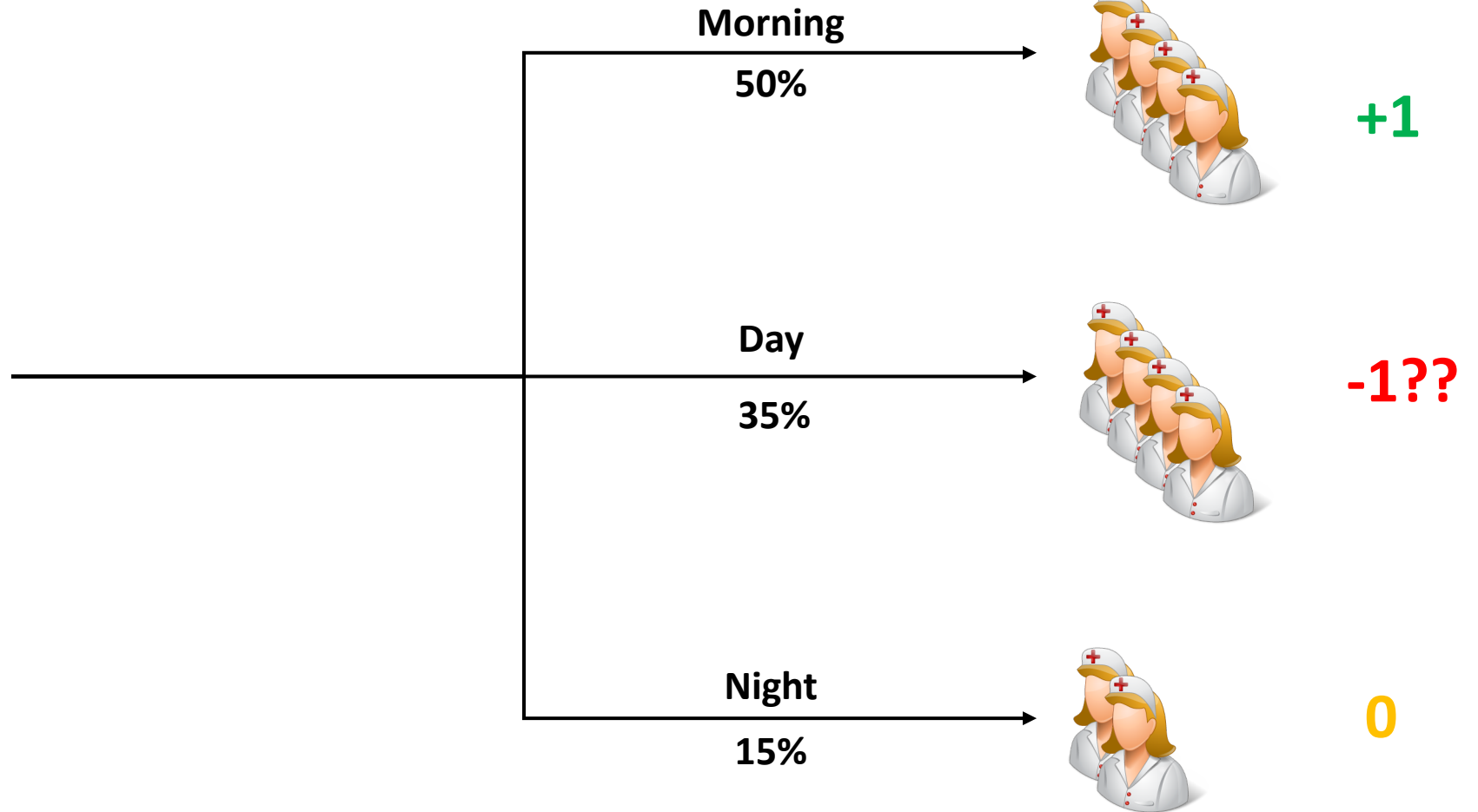
They are able to handle between 10 to 40 patients per shift before diverting patients to other EDs

Predicting Total Inflow and Planning

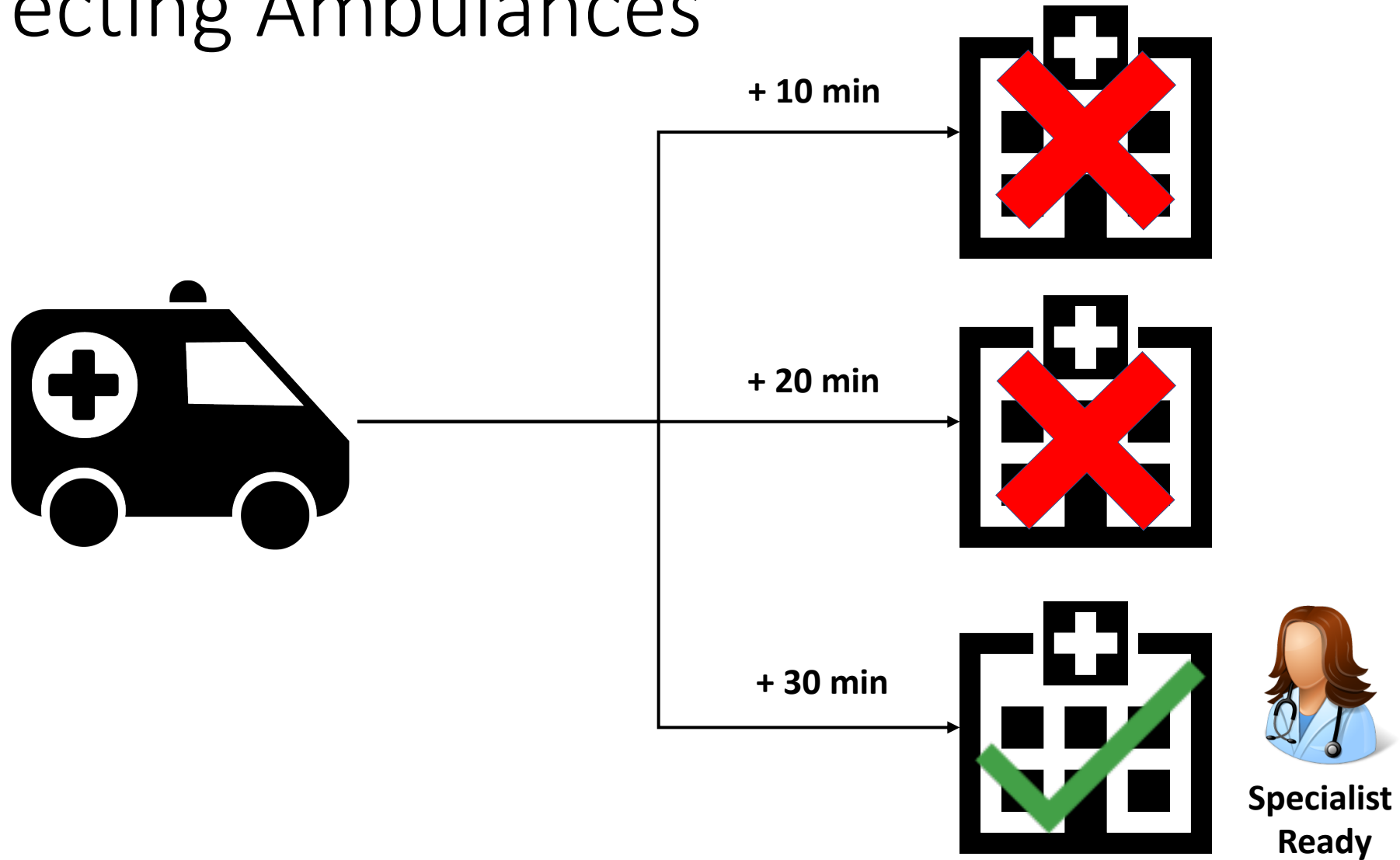
Staff Planning



100 Patients

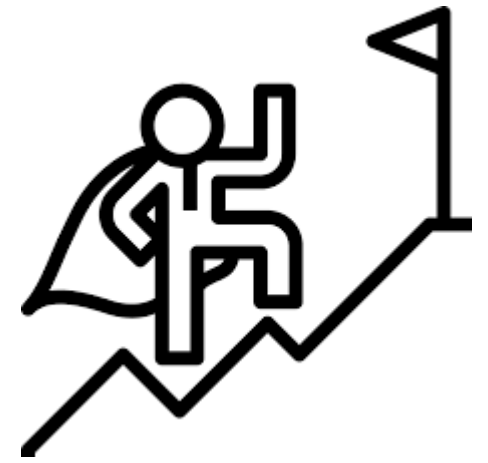


Directing Ambulances



Measures of success

- Reducing emergency stops from ambulance
- Reducing staff workload
- Optimize staff planning and resource allocation
- Showing live and future patient inflow



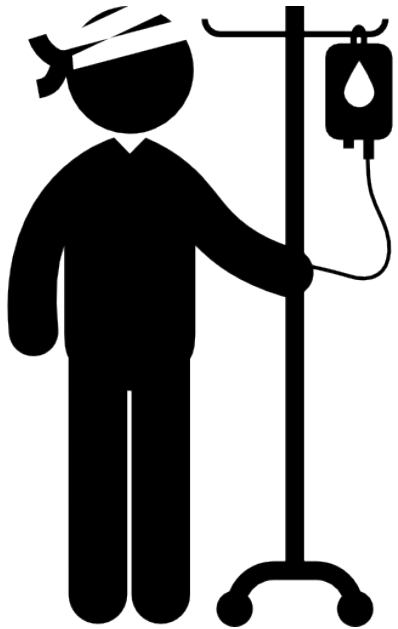
Prototype Dashboard



- Interactive view to see the live predictions based on input data
- Make available to roster maker with accompanying suggestion
- Start by predicting the next shift and scale to the upcoming week

Available Data

3 Years of Historical Patient Data



ID (repeatable)
Gender
Age Range
Urgency (Triage)
Illness Type
Time Spent
Exact Timestamp

Additional



Weather



Events

'dayofweek': 0-6
'month': 1-12
'Shift_type': Shift Times

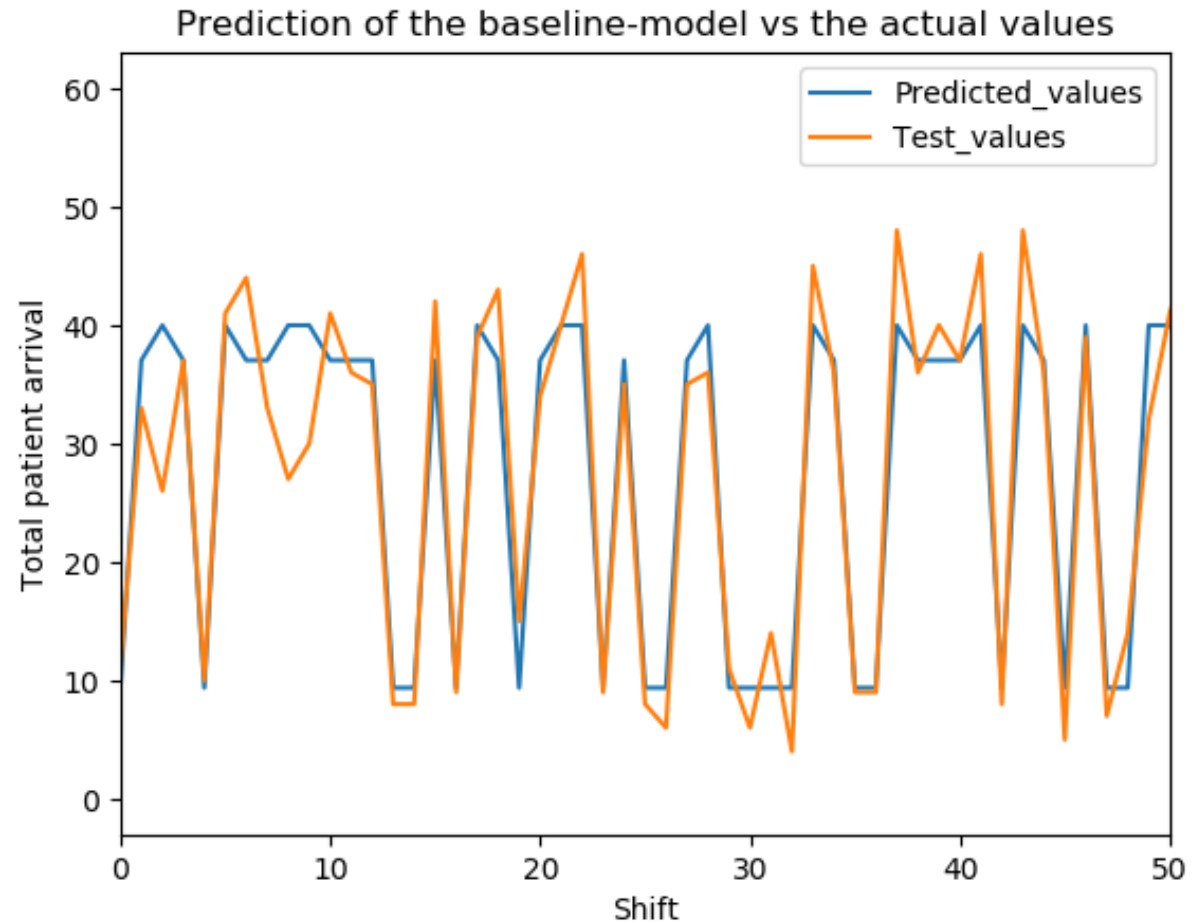
Baseline Model

Multiple Regressors tested:

GLM, KNN, Random Forest, Arima, LSTM

- X = Predictors (Shift) over time
- Y = Patient count for next shift

- Accuracy = 80%
- Max_Error = 22



Work in Progress...



- Change management to dynamically fill rosters
 - Employees prefer knowing further in advance when they need to work
- Implement proactive communications with Ambulances
- Run a live simulation based on newer models
- Define concrete actions that should be taken on model predictions

Takeaways



- AI can be powerful if applied correctly
- Applied Machine Learning is about identifying relevant business processes and providing relevant insights to **take actions**
- Solutions are applicable cross-industry and should be **implemented creatively**

Thank you !

@ Atos: “We help you drive operational excellence through Analytics & AI integration services”

For more information please join us at Atos Booth and contact us

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