

Data-driven at sea

→ Transforming an industry with Molslinjen

→ Presenter: Lasse Janerka, Business Director – Molslinjen





”Nobel Prize of Operations Research”

Molslinjen x Halfspace Edelmann Award

→ Winner

Achievement in Advanced Analytics,
Operations Research and Management
Science

14




13

11



10

9

American Airlines 

8



6

5
Trans>ision

4



3



Molslinjen in Numbers

15 M

Passengers

7.8 M

Car equivalent units

18

Ferries

10

Routes



Challenge

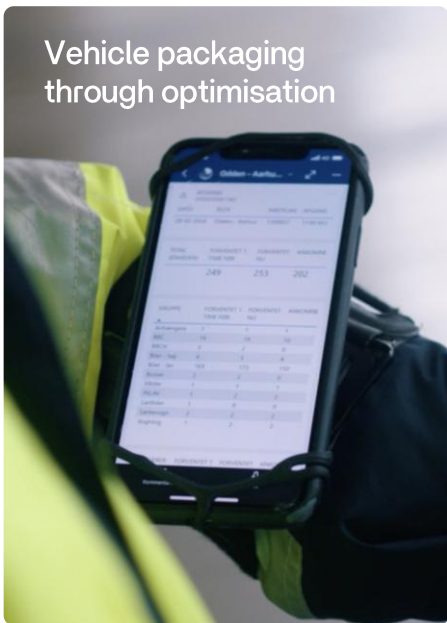
Rethinking ferry operations with data and AI



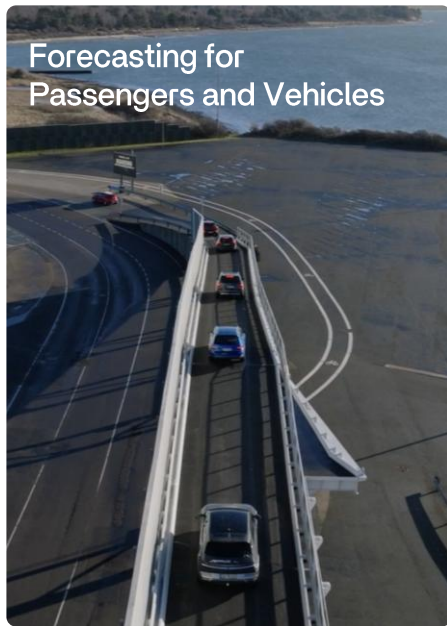
→ The plan

Think big, Start small

Vehicle packaging through optimisation



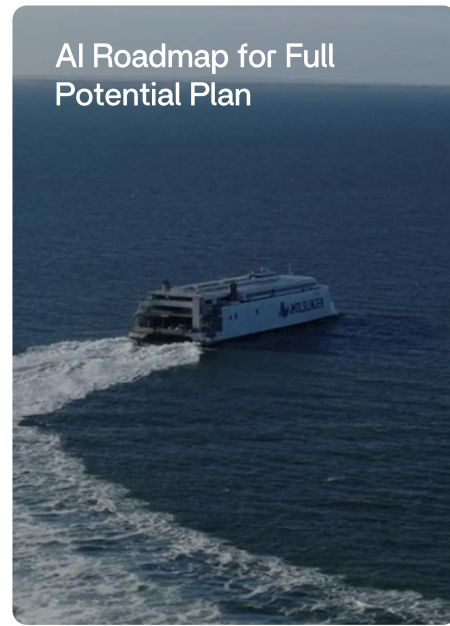
Forecasting for Passengers and Vehicles



Data-driven Revenue Management



AI Roadmap for Full Potential Plan





Molslinjen – Timeline

1966**Molslinjen established**

→ First route over Kattegat (between Jutland and Sealand)

2019**Forecasting and packing engine operational**

→ Ability to predict demand for a specific departure up to 1 year in advance

2020**Aquisition of Molslinjen by EQT**

→ Strengthening efforts in digitalisation of operations

2022**Revenue management engine operational**

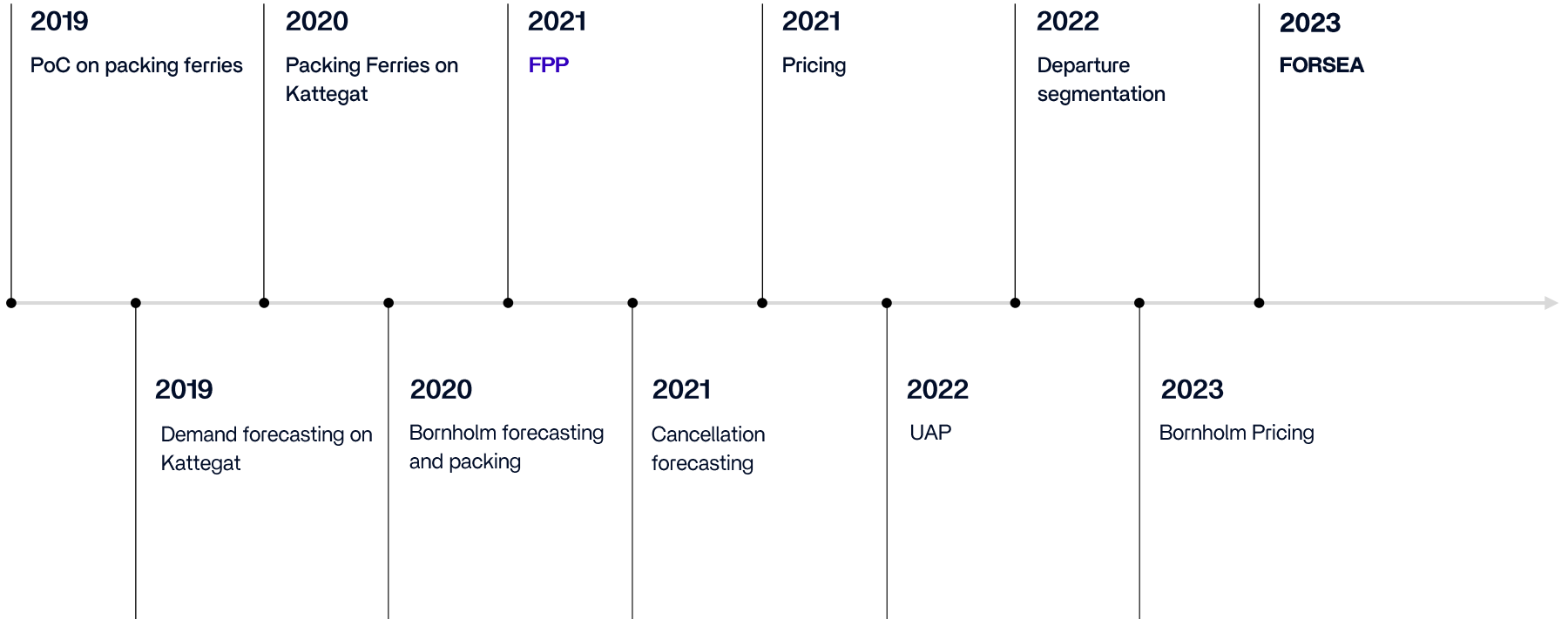
→ Dynamic pricing & revenue management based on a bespoke approach

2024-**Furthering data- and AI-driven operational practice**

→ Establish Molslinjen as a visionary leader in digitalising ferry operations



Detailed Roadmap





Vision

To use data and AI
to rethink passenger
ferry operations

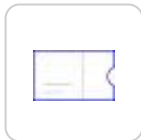


Molslinjen - Context

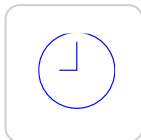
Departure Complexity



Up to > **1000 passengers** per departure
Up to > **330 vehicles** per departure

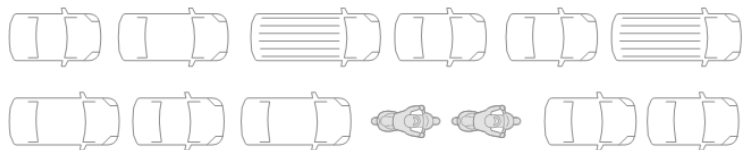
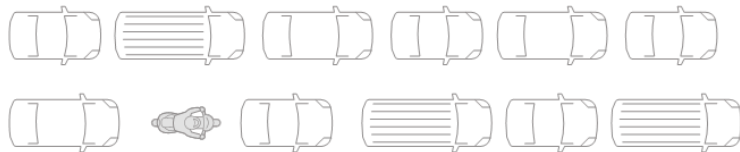
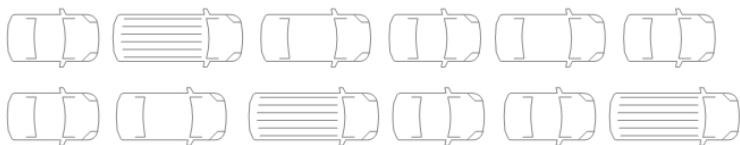
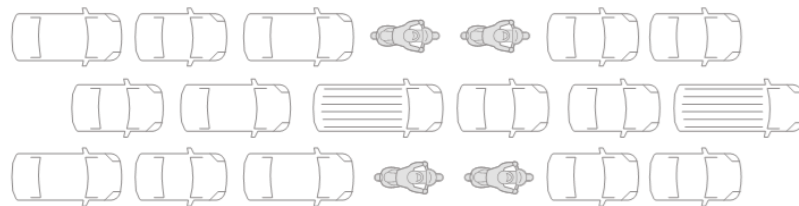
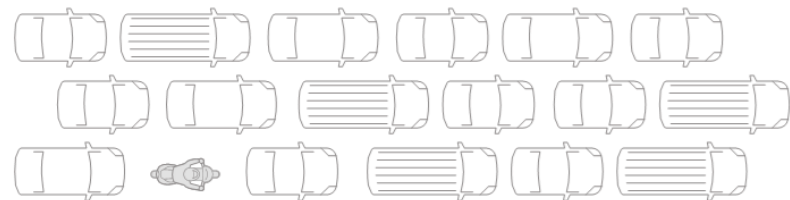
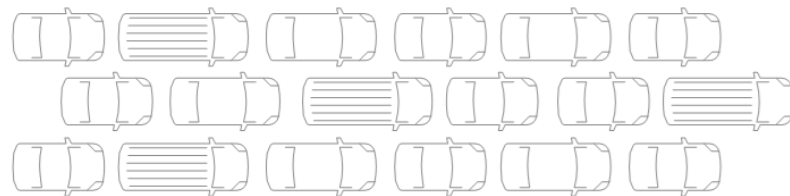


Customer classes with additional benefits
(e.g., **business customers**: no booking, late arrival, first to disembark)



20-30 mns in-between departures

→ Molslinjen – Vehicle Packing Configuration

2-by-2 Vehicle Configuration**Zipper** Vehicle Configuration

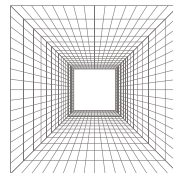


Innovative Forecasting System



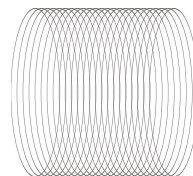
Forecasting

A three-step forecasting approach



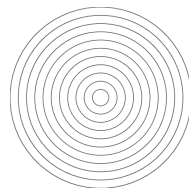
→ Initial

1-year prior to departure, based on historical data only, as well as date, time and location of departure.



→ Iterative

Forecasts are continuously updated any time new information on reservations become available.



→ Real-time

Just before the upcoming departure forecasts are continuously adjusted based on the speed and volume of vehicle arrivals, until the time of departure.



Forecasting

Timeline, data and decisions

Decisions	Decisions	Decisions
<ul style="list-style-type: none">• Departure Planning	<ul style="list-style-type: none">• Staffing• Pricing• Capacity Reservation	<ul style="list-style-type: none">• Packing Plan• Capacity Reservation

-1 Year



-1 Month



Updates



-1 Week



Updates



-1 Hour

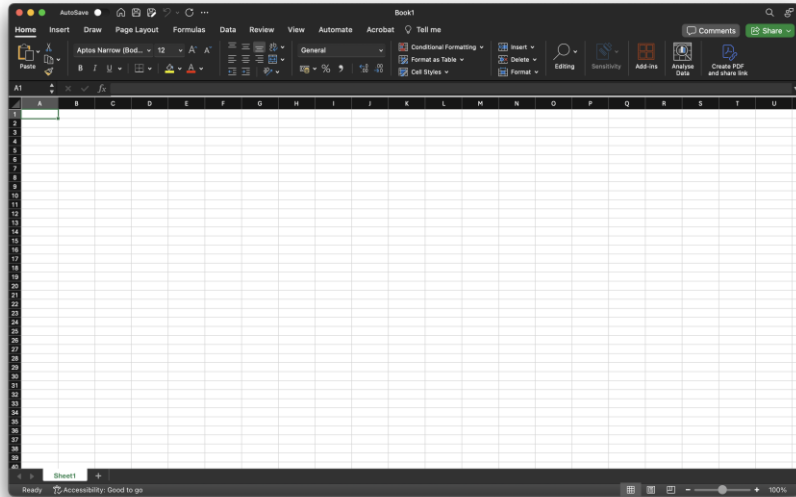


Target

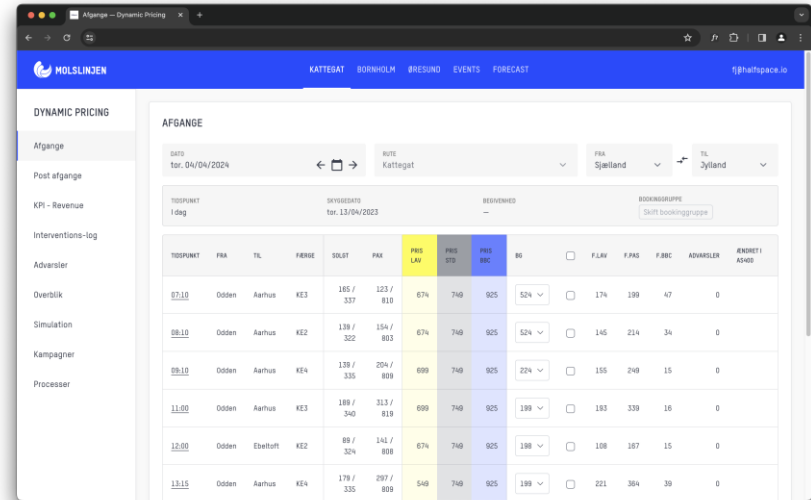
Features	Features	Features
<ul style="list-style-type: none">• Past demand• Calendar• Special Events	<ul style="list-style-type: none">• Past demand• Calendar• Special Events• Reservations• Customer Type	<ul style="list-style-type: none">• Past demand• Calendar• Special Events• Reservations• Customer Type• Check in

→ A Forecast Engine and Integrated BI Tool

Before
→ Manual Process



After
→ AI-Powered process



The screenshot shows the Molsslinjen Dynamic Pricing web application. The main content area displays a table of flight data for the route KATTEGAT. The table includes columns for TOSSPUNKT, FRA, TL, FÆRGE, SOLGT, PRX, PRS LAV, PRS STD, PRS BEC, IN, F.LAV, F.PAG, F.BEC, ADVAKLER, and ÆNDRET ASAB. The data is organized into rows for different flight segments, with some cells highlighted in yellow and blue.

TOSSPUNKT	FRA	TL	FÆRGE	SOLGT	PRX	PRS LAV	PRS STD	PRS BEC	IN	F.LAV	F.PAG	F.BEC	ADVAKLER	ÆNDRET ASAB
07.10	Odden	Aarhus	KE3	185 / 337	123 / 810	674	740	925	524	<input type="checkbox"/>	174	199	47	0
08.10	Odden	Aarhus	KE2	139 / 322	154 / 893	674	740	925	524	<input type="checkbox"/>	145	214	34	0
09.10	Odden	Aarhus	KE4	138 / 335	204 / 809	699	740	925	224	<input type="checkbox"/>	155	249	15	0
11.00	Odden	Aarhus	KE3	189 / 340	313 / 819	690	740	925	199	<input type="checkbox"/>	183	339	16	0
12.00	Odden	Ebeltoft	KE2	89 / 324	141 / 808	674	740	925	198	<input type="checkbox"/>	108	187	15	0
13.15	Odden	Aarhus	KE4	179 / 335	297 / 809	549	740	925	199	<input type="checkbox"/>	221	364	39	0



Dynamic Pricing Strategy





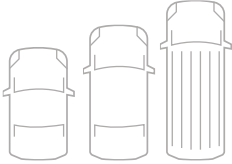

Dynamic Pricing

Inspired by
practices in
other industries

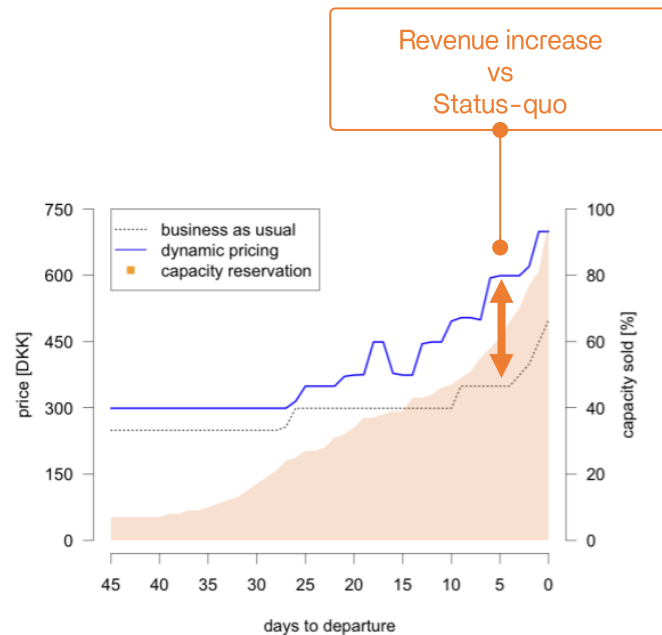


→ Dynamic Pricing

Two key technical challenges addressed

 Challenge	Intelligent Capacity Management	 Challenge	Price-sensitive Demand Model
<ul style="list-style-type: none">Remaining capacity for ticket sales not knownDependent on size of arriving cars 	<ul style="list-style-type: none">Based on actual car sizes in bookings + Expected car sizes given departure <div data-bbox="556 814 909 958">Output Expected available tickets for sale</div>	<ul style="list-style-type: none">All LowFare tickets are the sameEssential to understand price sensitivity of customers 	<ul style="list-style-type: none">Causal price dependenceBayesian Neural Network + Parametric effect of contextual variables <div data-bbox="1450 814 1804 958">Output Expected demands <i>given</i> price</div>

Maximizing revenue from all departures based on customer willingness-to-pay



Case in Point

Departure 3 September 2023 at 7.15PM
Jutland to Zealand



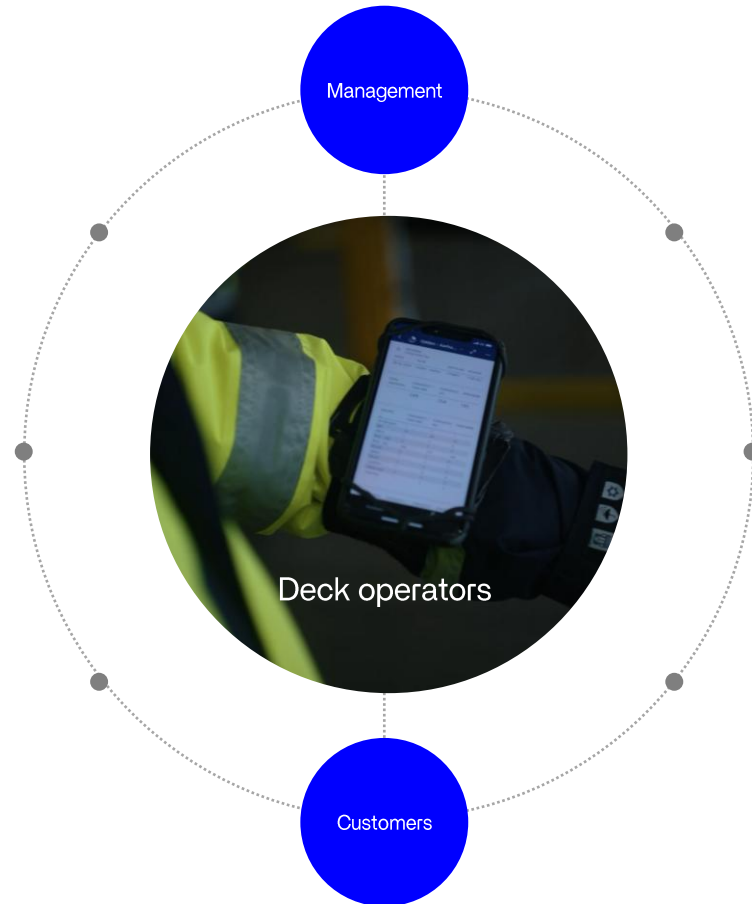
Ferry operations reimagined

Before

- Engaged in **repetitive, manual tasks**.
- **Limited focus** on strategic decision-making.
- **Stressful process** with ferry packing with limited visibility on arrivals, vehicle types, etc.
- Higher chances of **job dissatisfaction**.

→ After

- **Employees engaged** in the digitalisation process
- Shift to **strategic, engaging work**.
- Focused on **decision-making** and operational **improvements**.
- Increased **job satisfaction** and productivity.







Impact – Quantitative Analysis

Tremendous impact on operational, environmental and financial KPIs

\$3.2 M Yearly revenue
increase (up to)

Assessment is based on

- Departure delays
- Fuel consumption
- Capacity utilization
- Effective sales
- Revenue
- Etc.

→ Impact – Operational Indicators

3.5%

Decrease in the number of delayed departures

1.5 Min

Reduction in average departure delay

3%

Reduction in overall fuel consumption

6%

Increase in available capacity utilization

60%

Time reduction in planning time



Impact – Economic Indicators

\$1.8 M

Fuel cost reduction across Molsslinjen's ~8,000 yearly departures

5 K+

Increase in effective ticket sales capacity on full departures

6%

6% increase in tickets on full departures

7–15%

Increase in revenue on full departures, a 1–2% boost to the overall revenue of more than \$72 mill



Closing

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