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Predicting Machinery Downtime

Ahsan Ahmad

Charlie Vandel

Scott Silverstein

Rylan Tribush

Business Problem

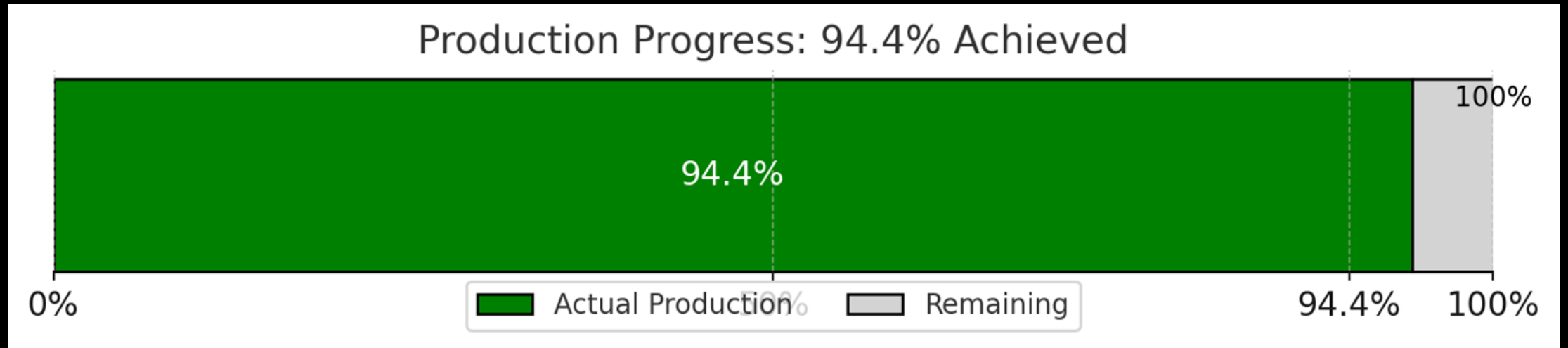
Downtime Costs



Machines fail unexpectedly.
Output drops. Deadlines
missed.

IMPACT

Efficiency Matters.



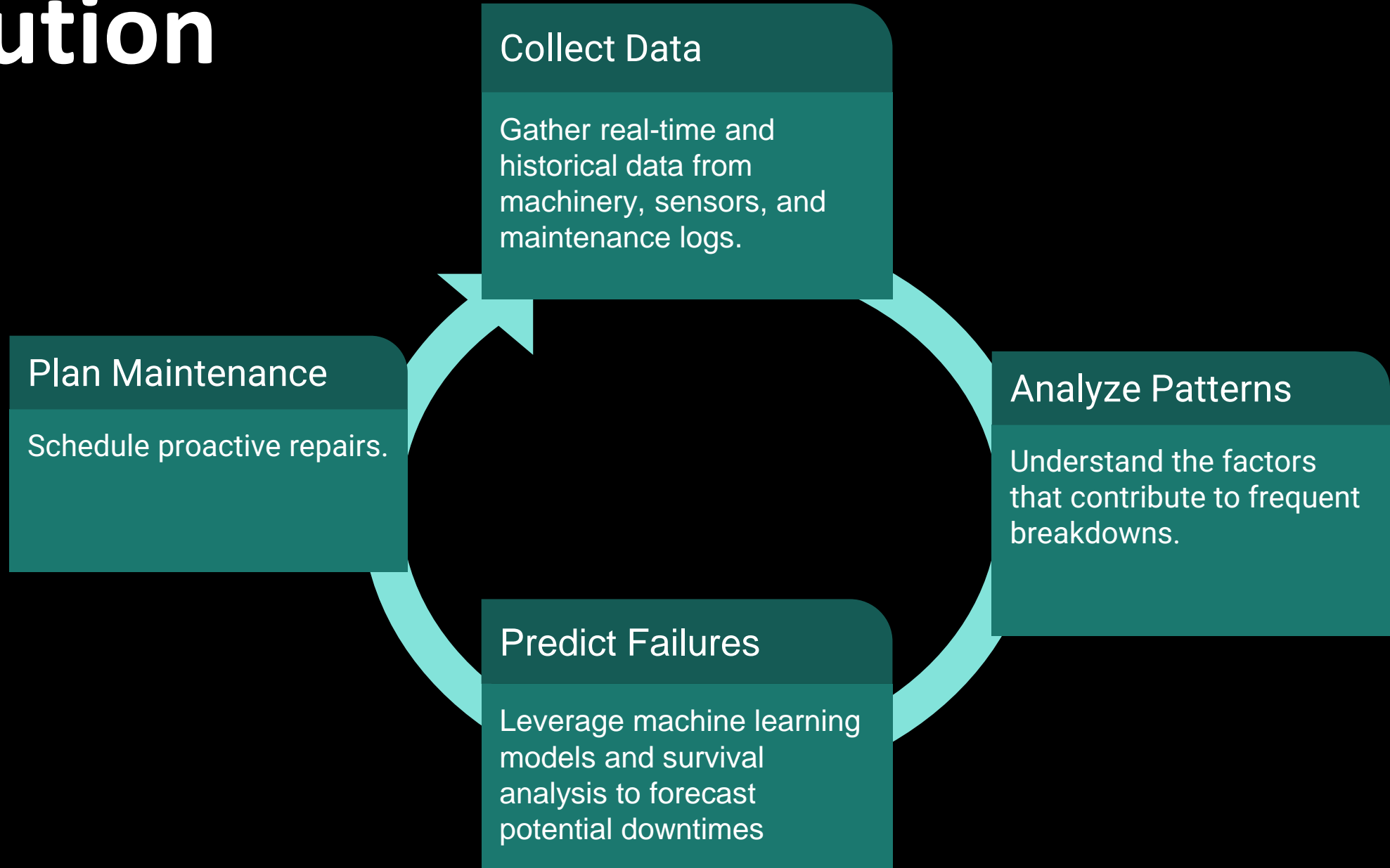
-\$60M

What success looks like



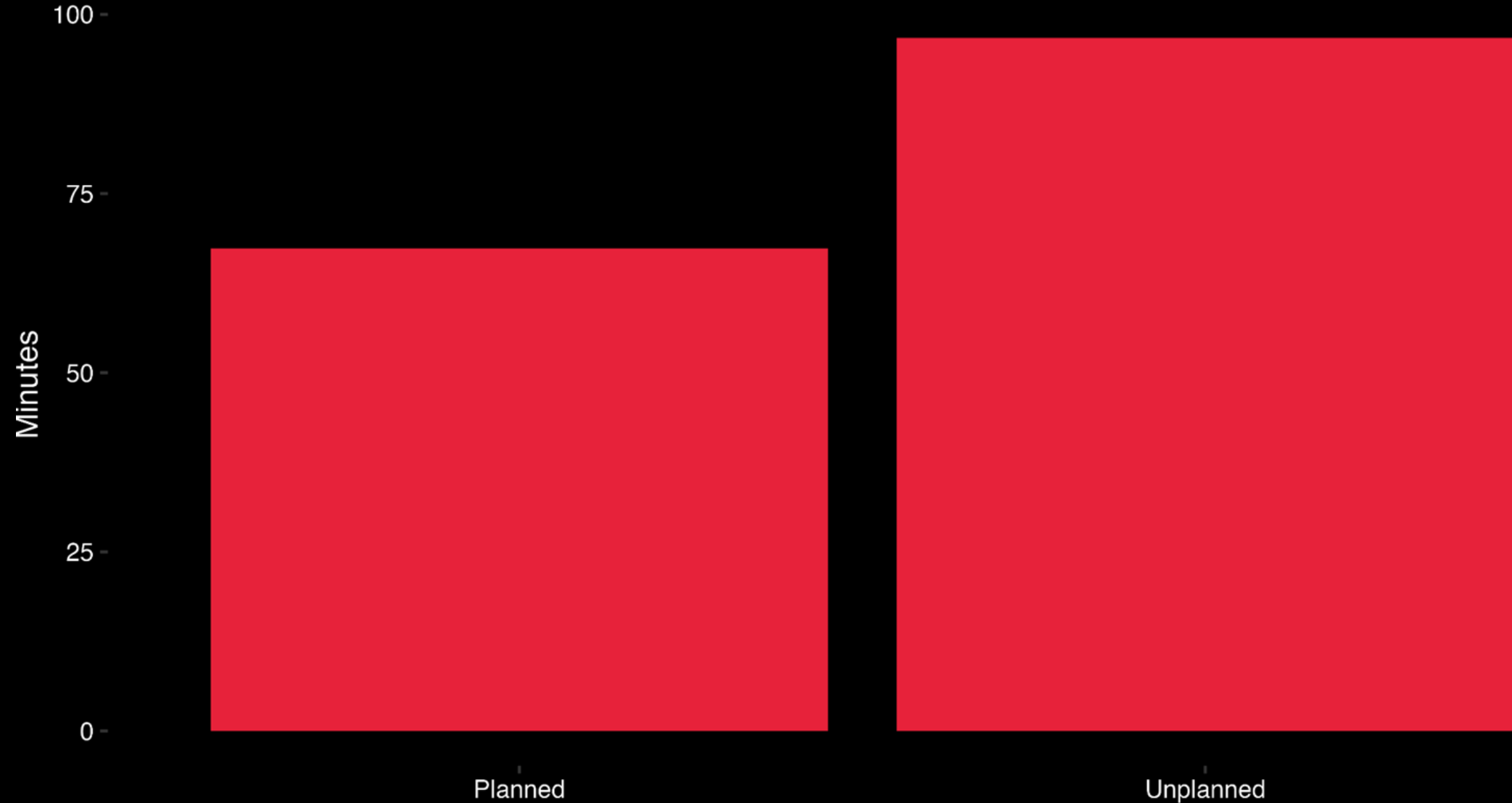
- Reliable: Machines running consistently without unexpected stoppages.
- Efficient: Maximized output with minimal delays.
- Scalable: A solution that grows with your production needs.

Solution

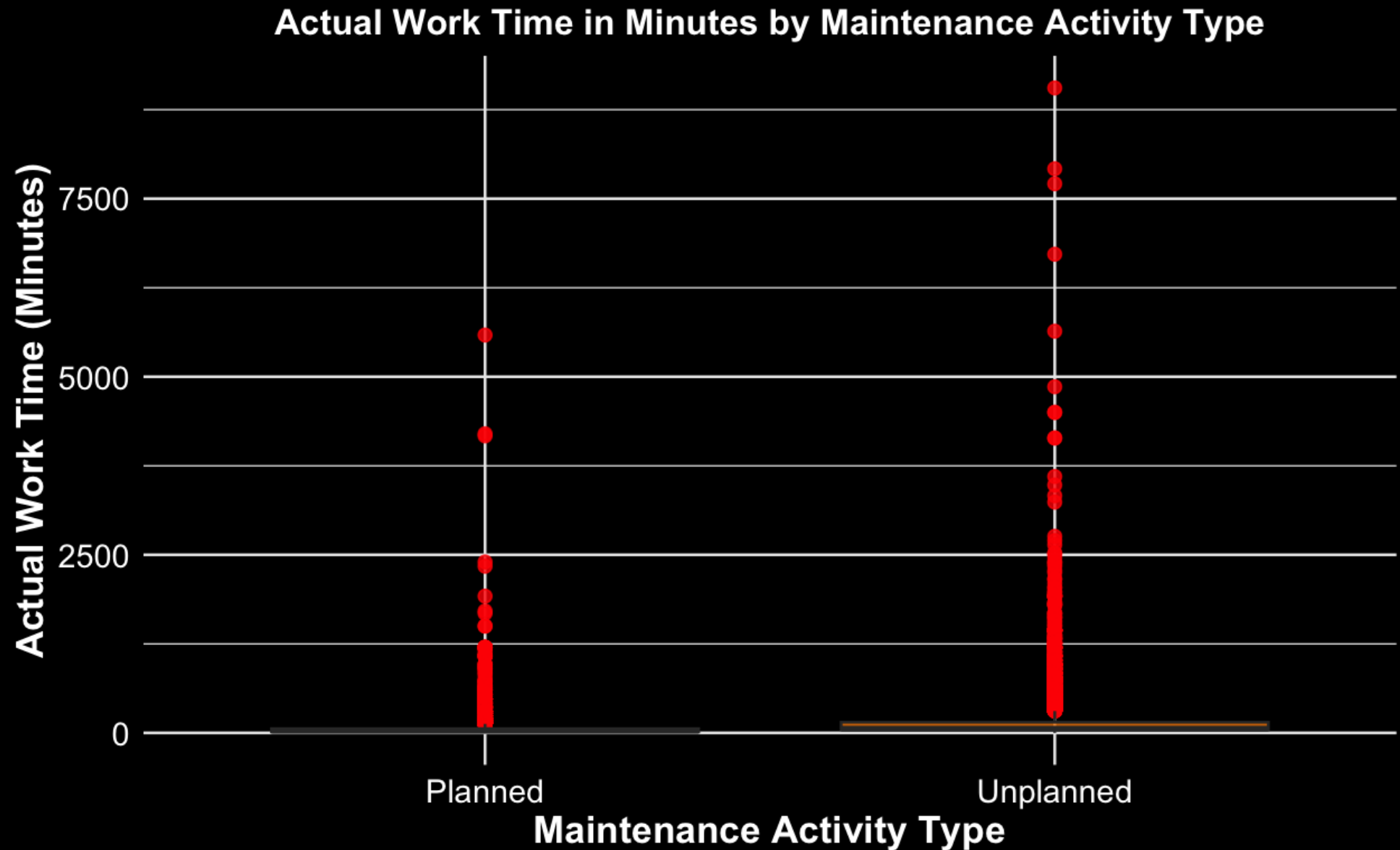


Planned vs Unplanned Failures

Unplanned Work Orders Take Longer on Average

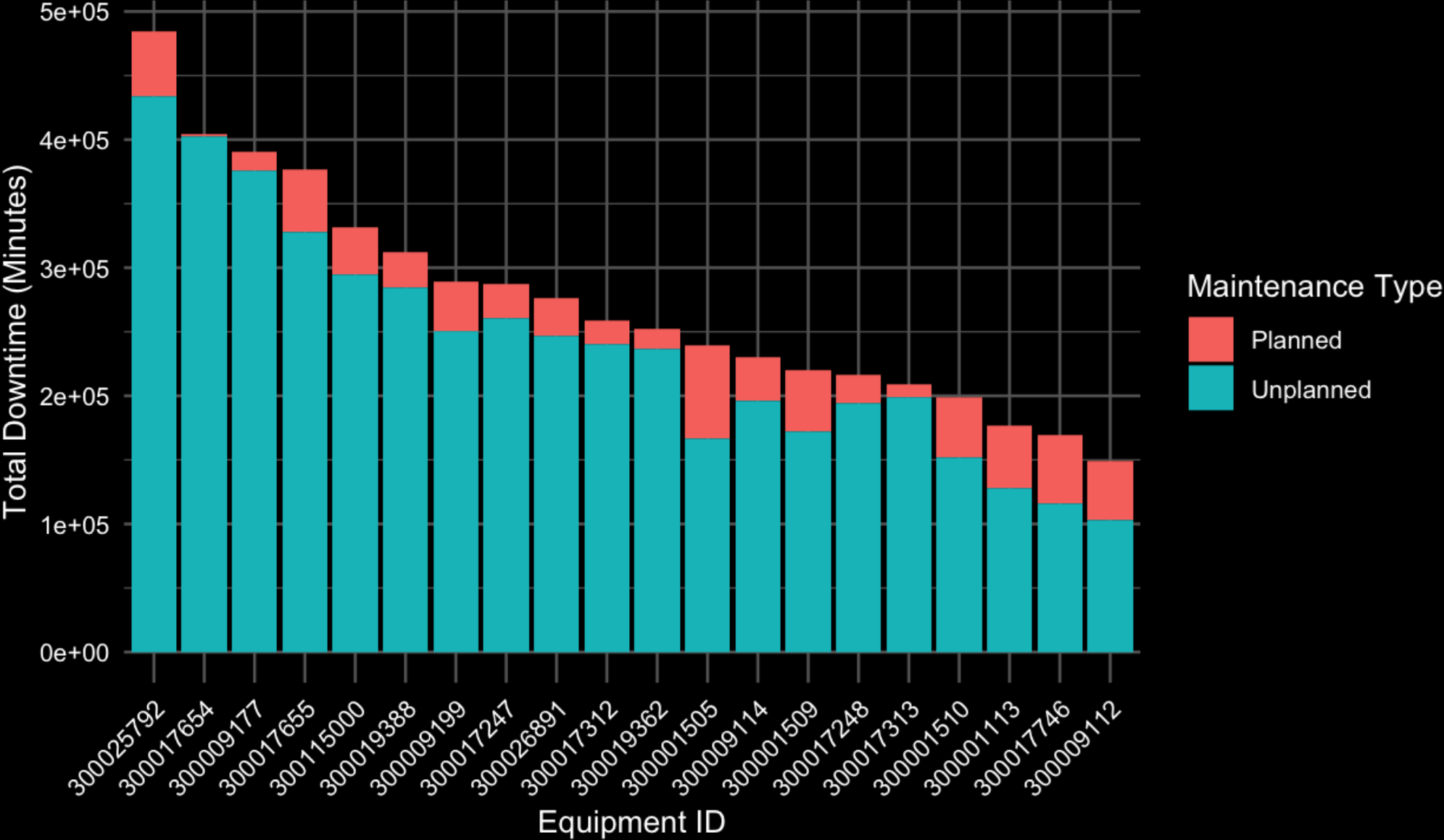


Failure Types Cont.



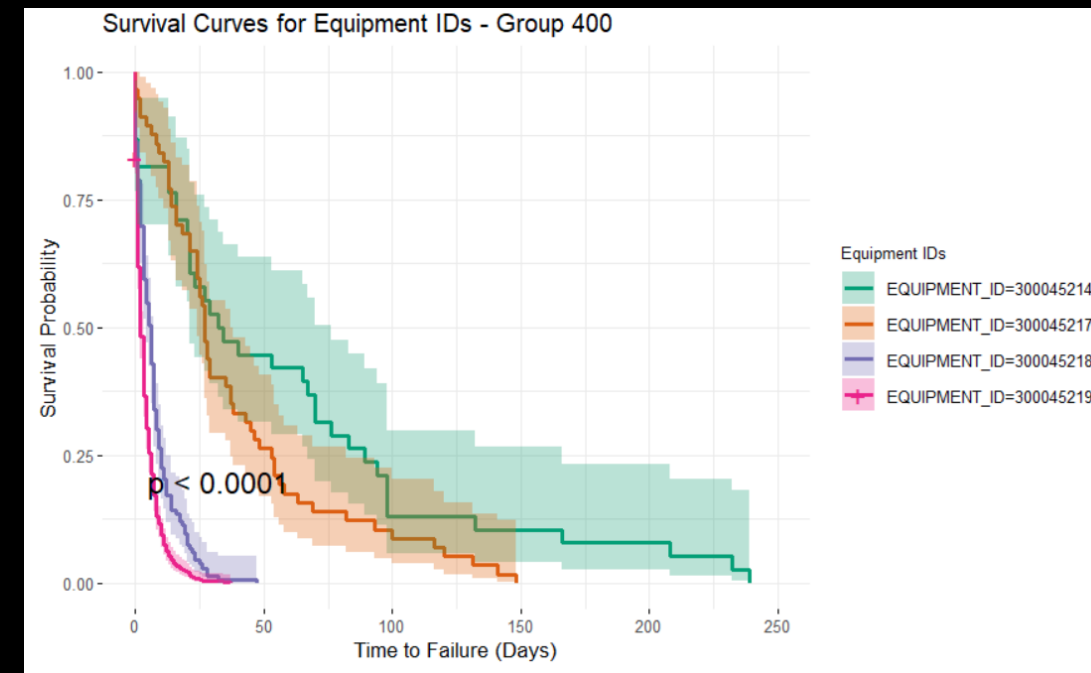
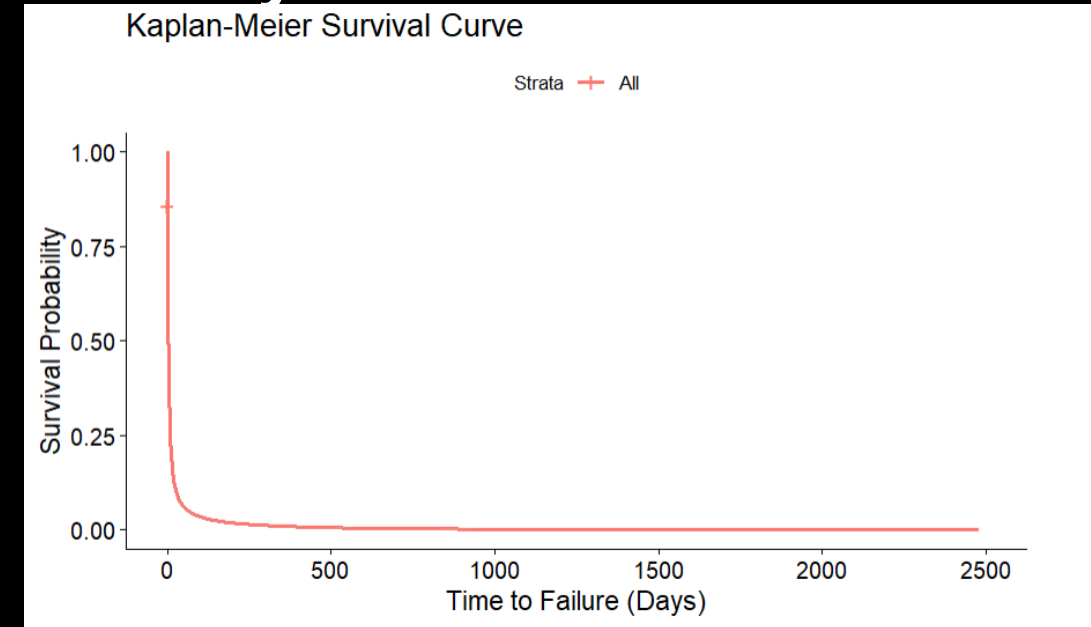
Equipment_IDs With Highest Downtime

Top 20 Equipment IDs with Downtime (Planned vs. Unplanned)



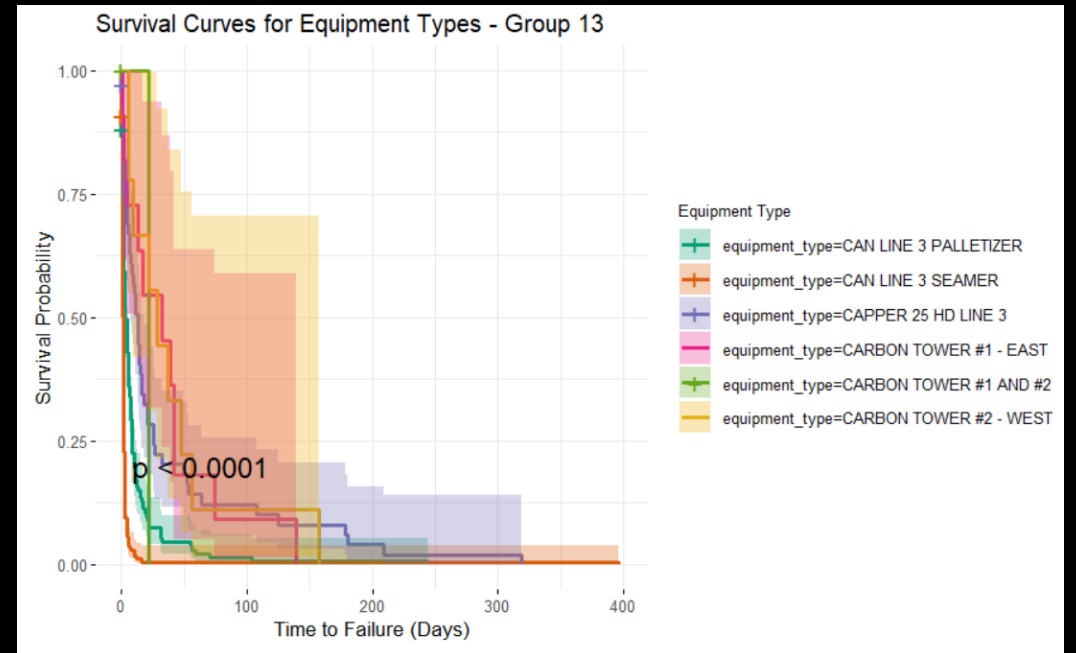
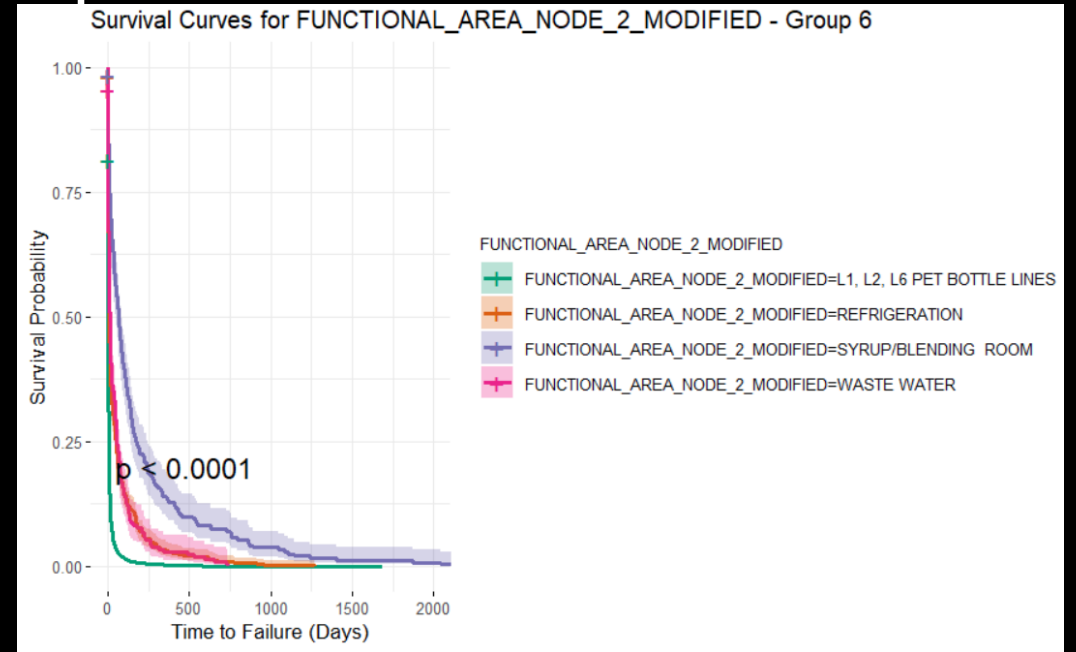
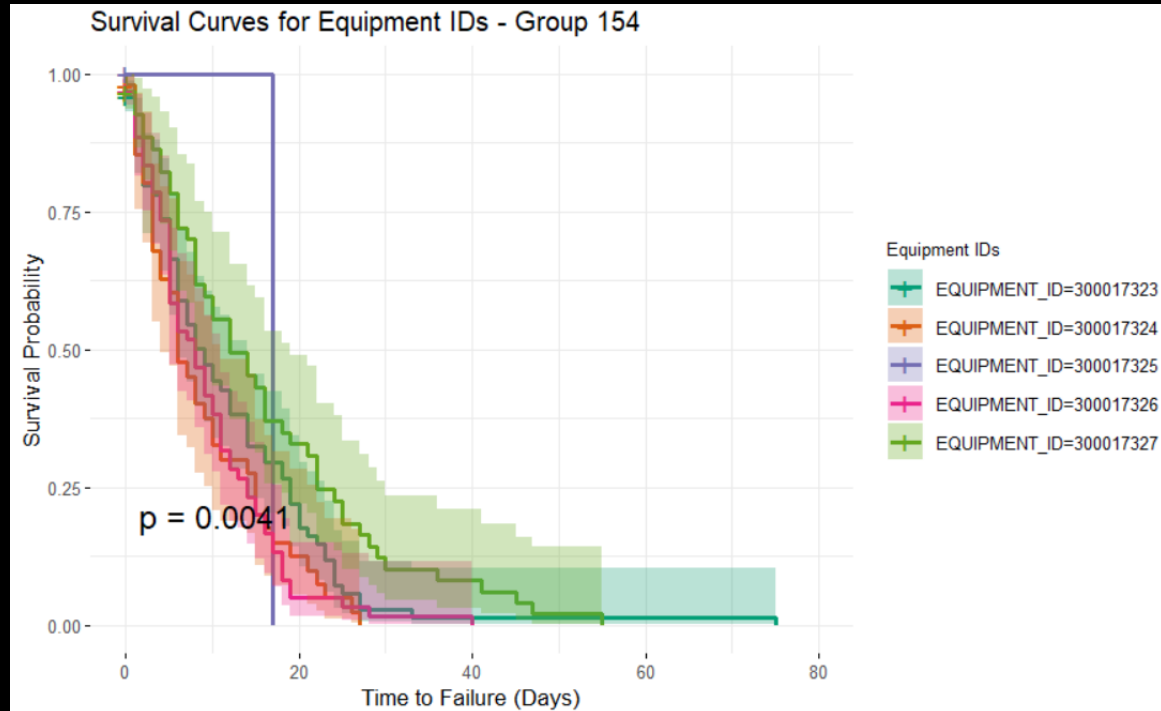
Our Solution: Survival Analysis

- A statistical approach to model the time until an event occurs e.g. machine failure
- Improves Maintenance Planning to reduce downtime and cost
- Identifies high risk Equipment that contributes to failure
- Kaplan-Meier Survival Curve to show survival probability across all 7 years
- p-value: <0.0001

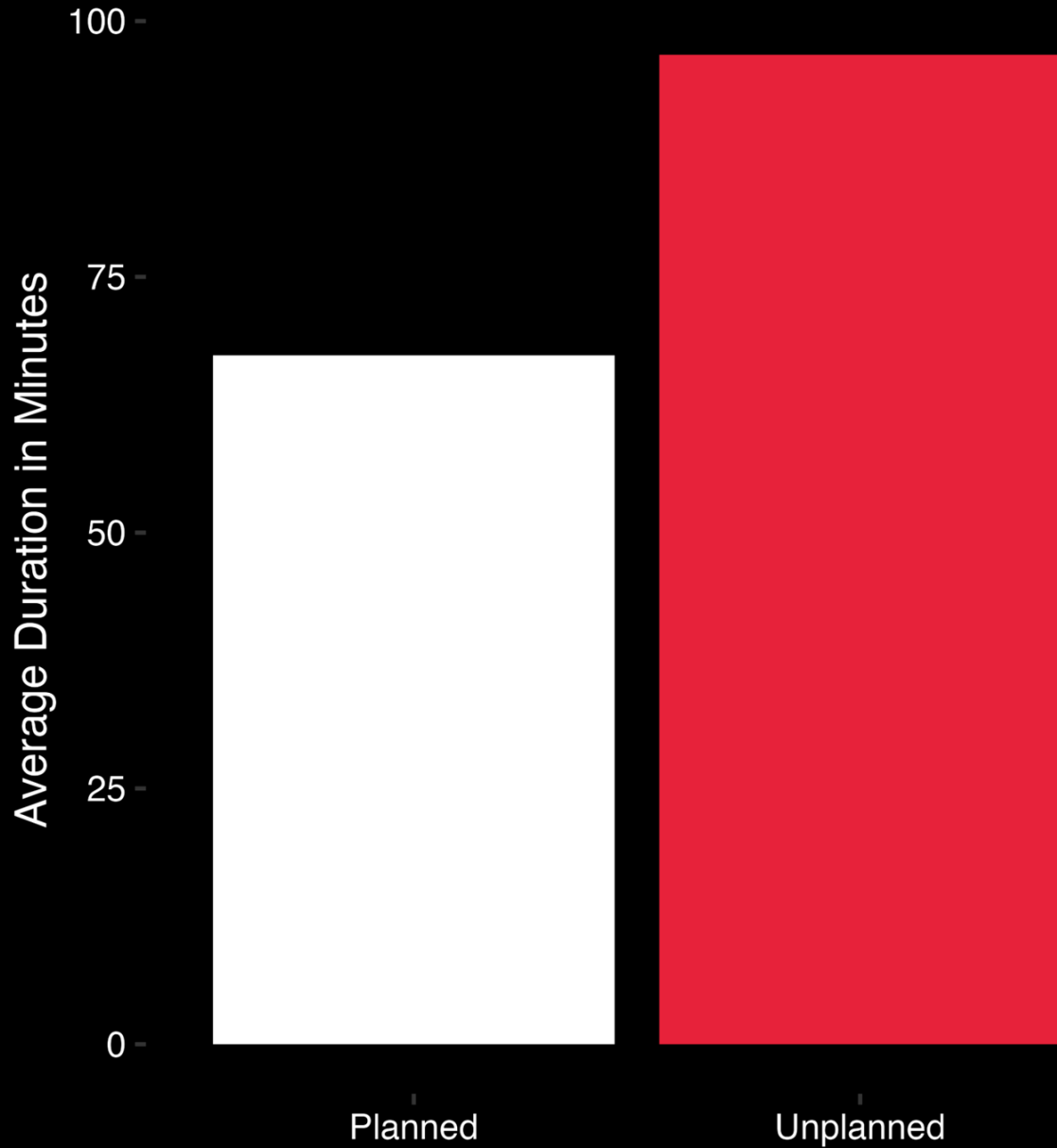


Survival Analysis Across Multiple Granularities

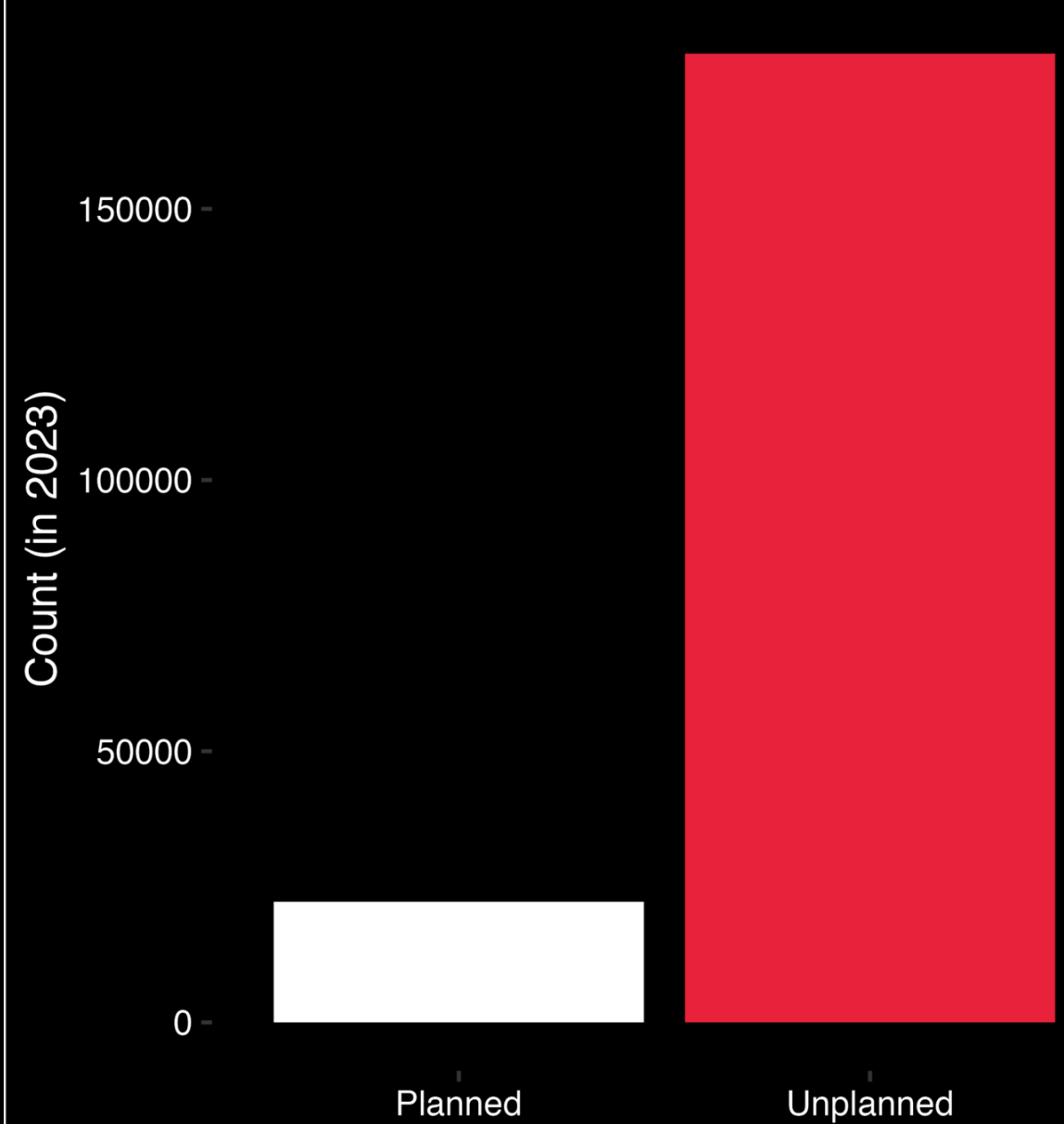
- Survival Analysis at Varying Levels of Detail: From Functional Area to Equipment Types to Equipment IDs
- A total of 2956 Survival Curves were created for each Equipment ID, limited p-value due to the proportion of data available



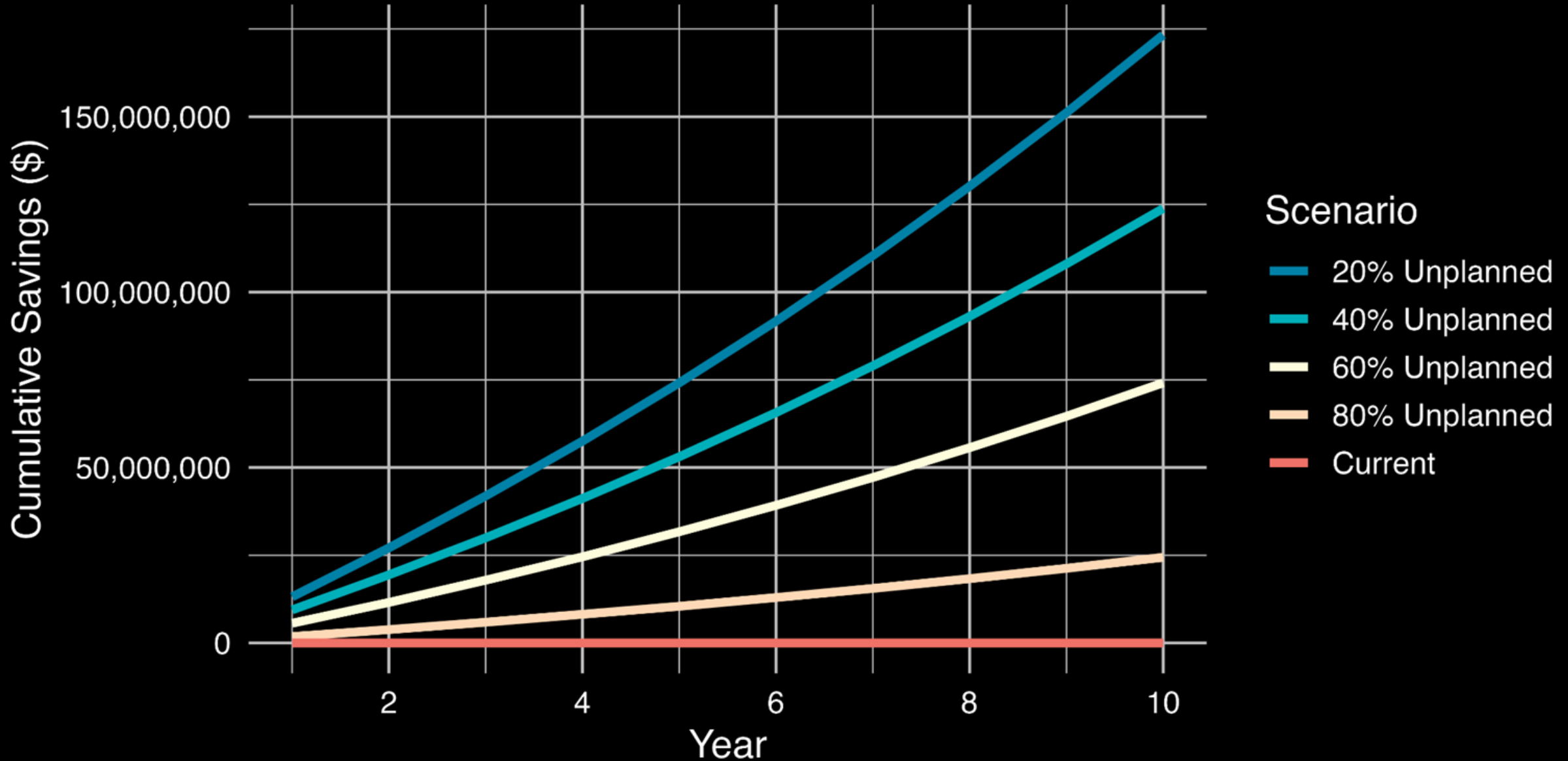
Unplanned Work Orders Take Longer



And There Are Many More Unplanned Orders



Cumulative Savings from Reducing Unplanned Downtime



Created using bootstrap samples from 2023 data, 6% interest rate, 200000 work orders per year, \$3.20 cost per minute of downtime.

Thank You!