



# Scheduling Dynamics of a Weight Management Program

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# Scheduling Dynamics of a Weight Management Program

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# Research Team



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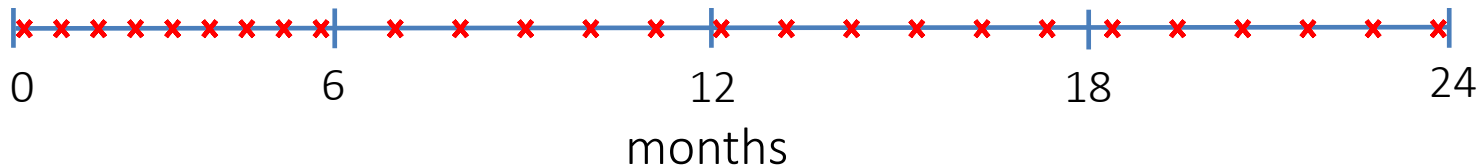
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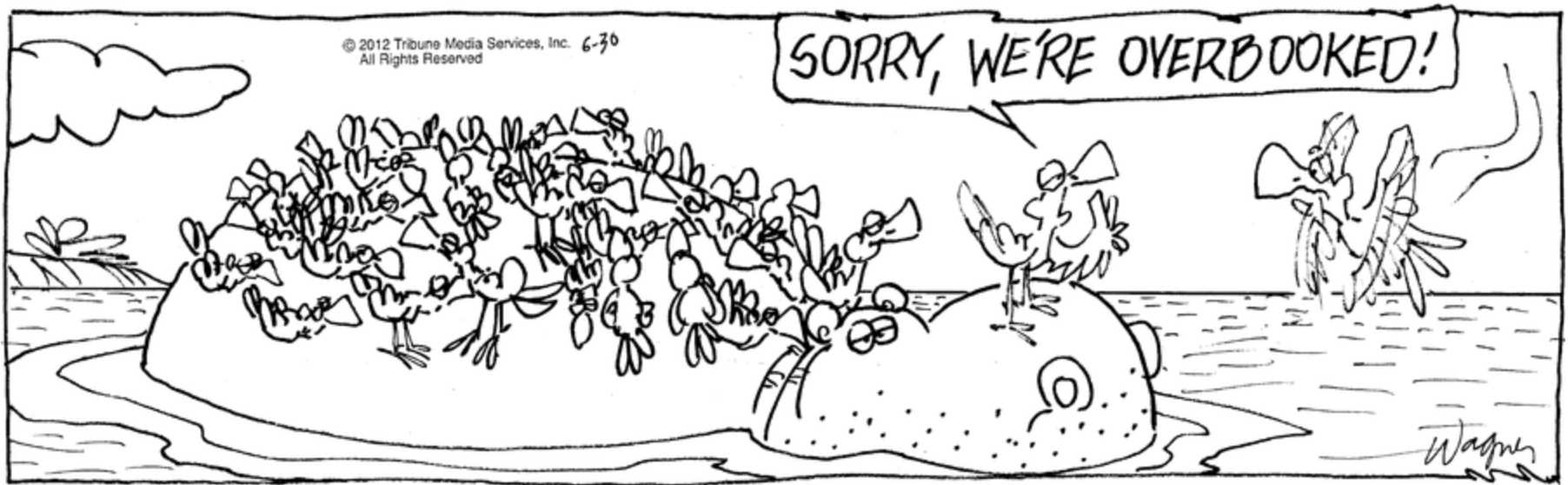
# Weight Management Program

- 2-year program designed by Amy Rothberg, MD
  - Promote weight reduction
  - Support behavioral change
- Basic eligibility
  - BMI  $\geq 32$  kg/m<sup>2</sup> with 1 or more comorbidities
  - BMI  $\geq 35$  kg/m<sup>2</sup>
- Program timeline



# What's the problem?

- Patients waiting too long to get into program



# Database approach

- Data: 2 spreadsheets **daily**
  - Prospective appointment, provider availability data
- Design MySQL-based database
- Store information about appointments in rolling horizon basis
  - Appointment schedule snapshots
- Compare snapshots from one day to another

# Database example

Appointment		Snapshot Date		
Date	Time	5/25	5/26	5/27
5/27	09:00	A <i>Cancelled</i>		C <i>Created</i>
	09:15			
	09:30			
	09:45	B	B <i>Cancelled</i>	
	10:00	Buffer		
	10:15			B <i>Created</i>

# Case study

Provider A cancels  
Reschedules for Provider B  
Patient cancels  
Refilled



Reschedules for Provider B  
Patient cancels

Appointment

A blue arrow pointing upwards, representing an appointment, is enclosed within a green circle. A large red 'X' is superimposed over the circle, indicating a cancellation.

Appointment

A blue arrow pointing upwards, representing an appointment, is shown with a large red 'X' superimposed over it, indicating a cancellation.

Sept 24

25

26

27

28

Main takeaways:

1. Multiple opportunities were used for one appointment
2. Impact of late cancellations



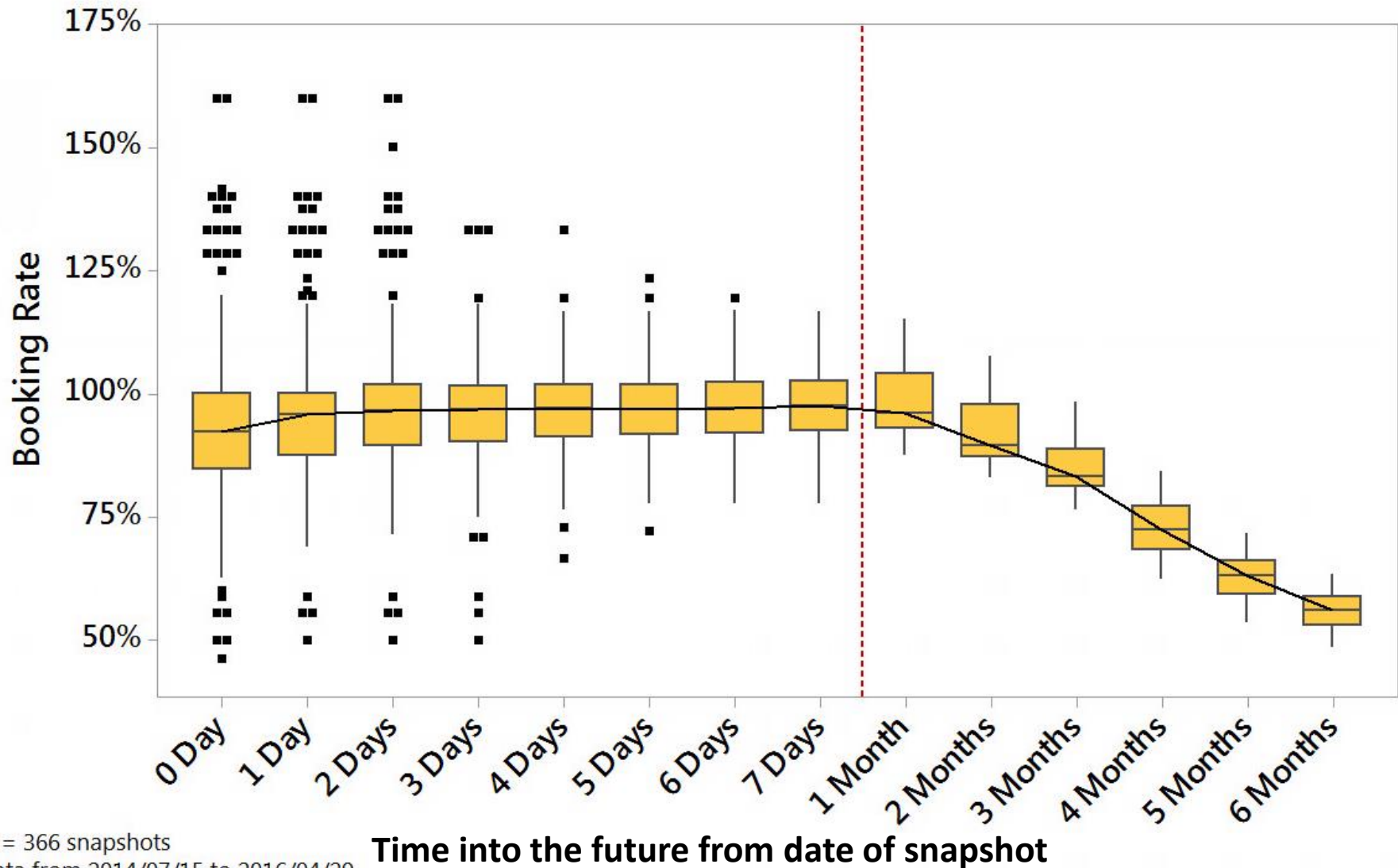
# Study objectives

- Understand and quantify scheduling dynamics
  - Booking rates
  - Cancellations
  - Refill of emptied slots due to cancellations

Results:

## High variability in short term booking rate

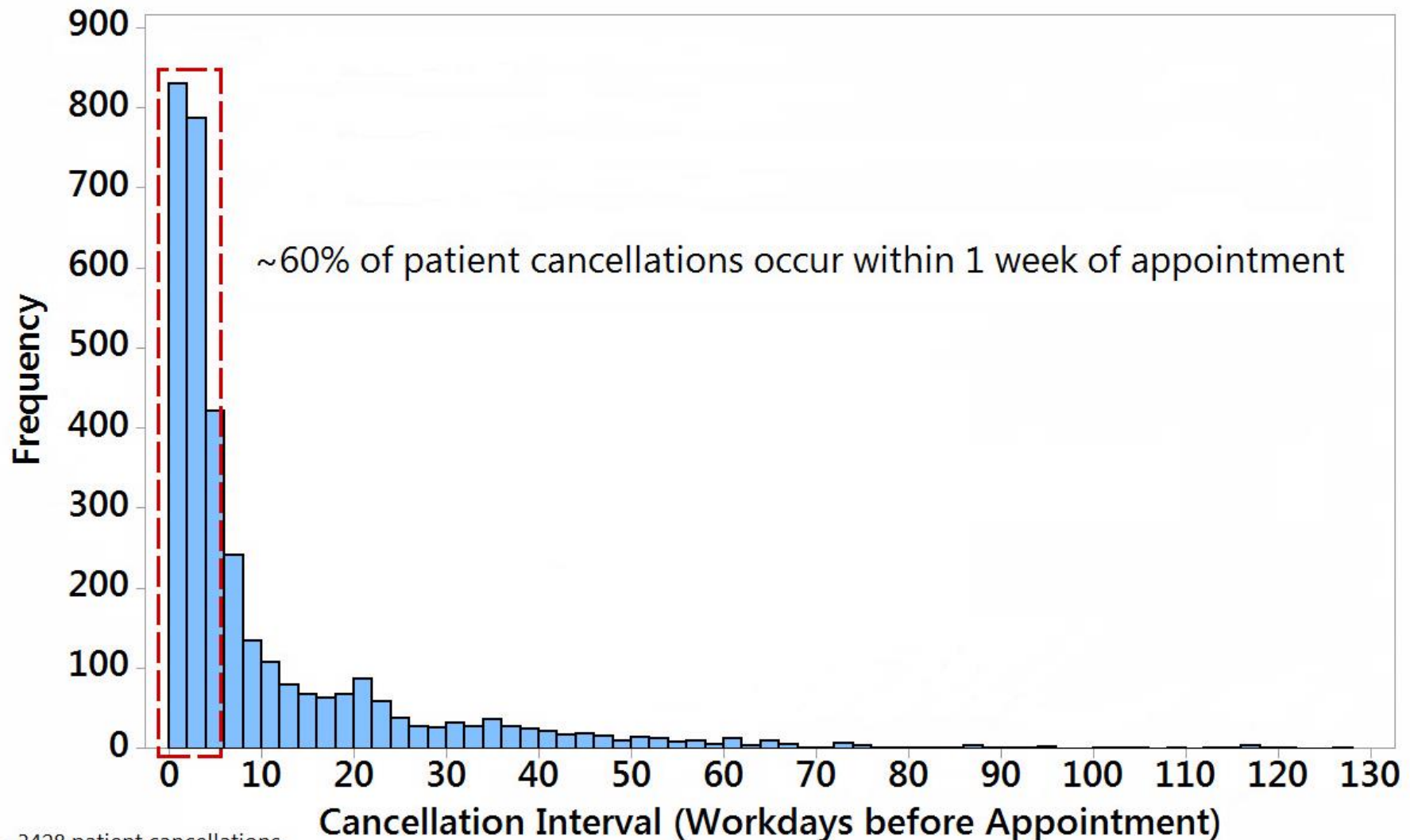
Average booking rates within x time period from date of snapshot



Results:

## High number of late cancellations

How early do patients cancel their appointments?

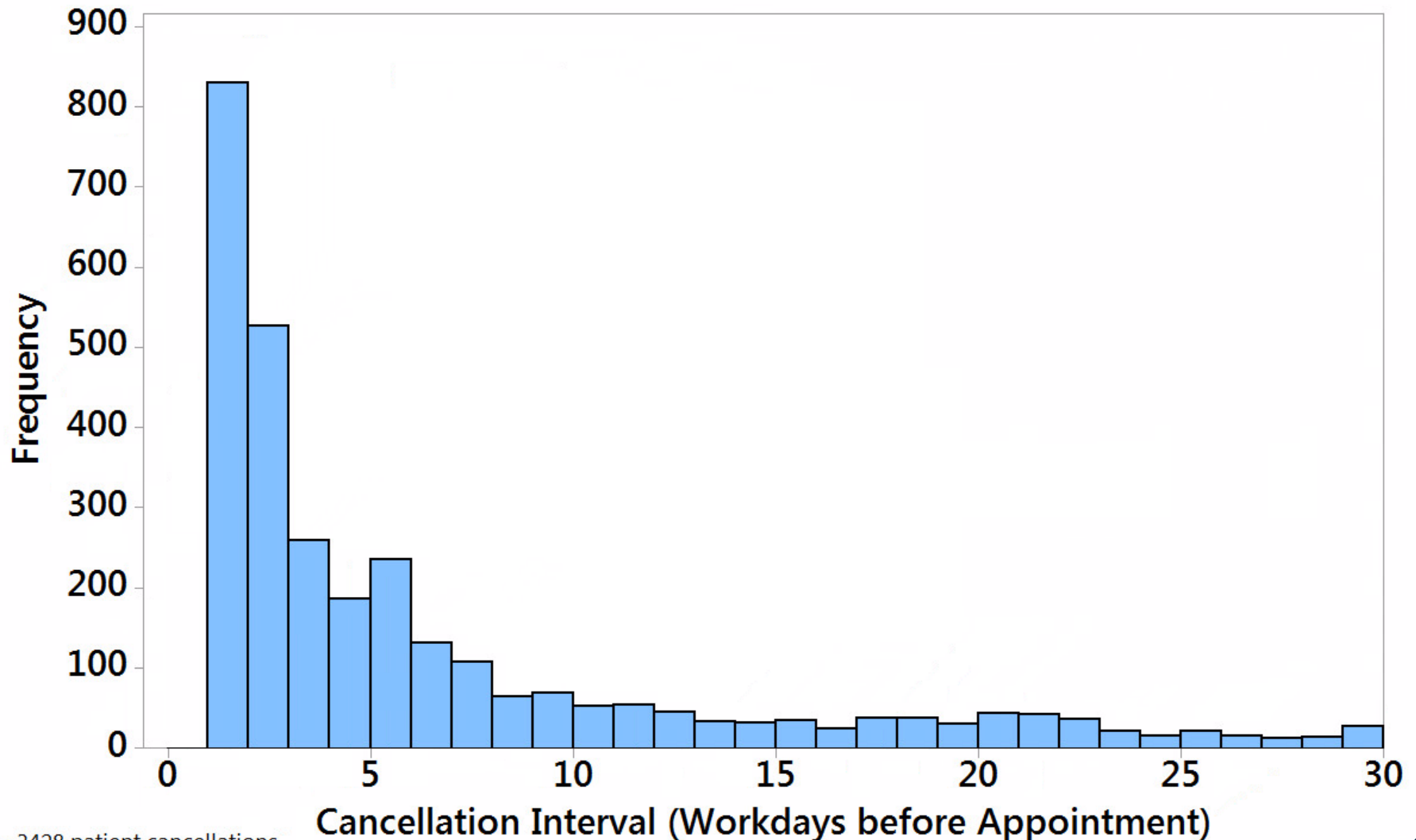


N = 3428 patient cancellations  
Data from 2014/07/15 to 2016/04/29

Results:

## High number of late cancellations

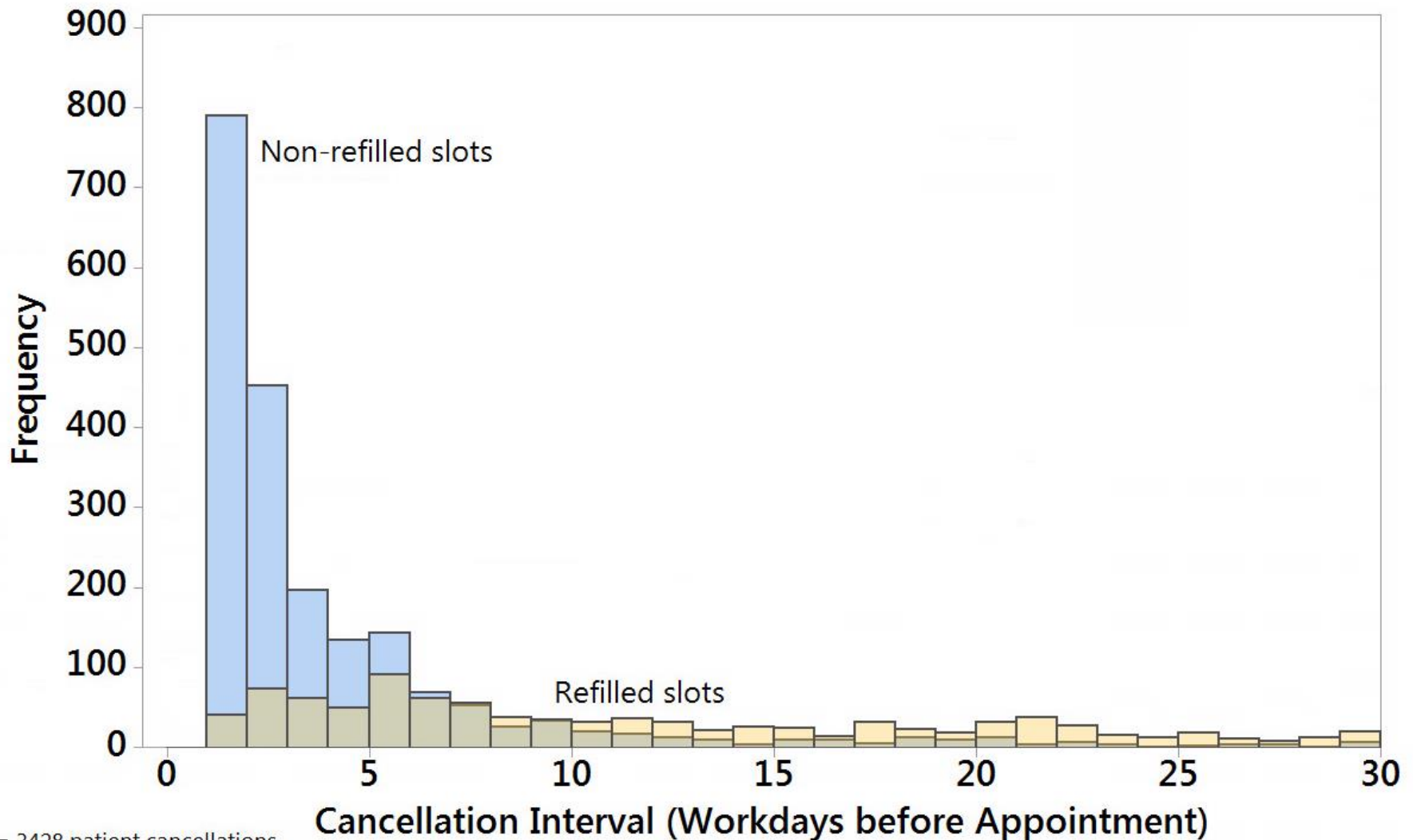
How early do patients cancel their appointments?



Results:

## Difficult to refill slots under late cancellations

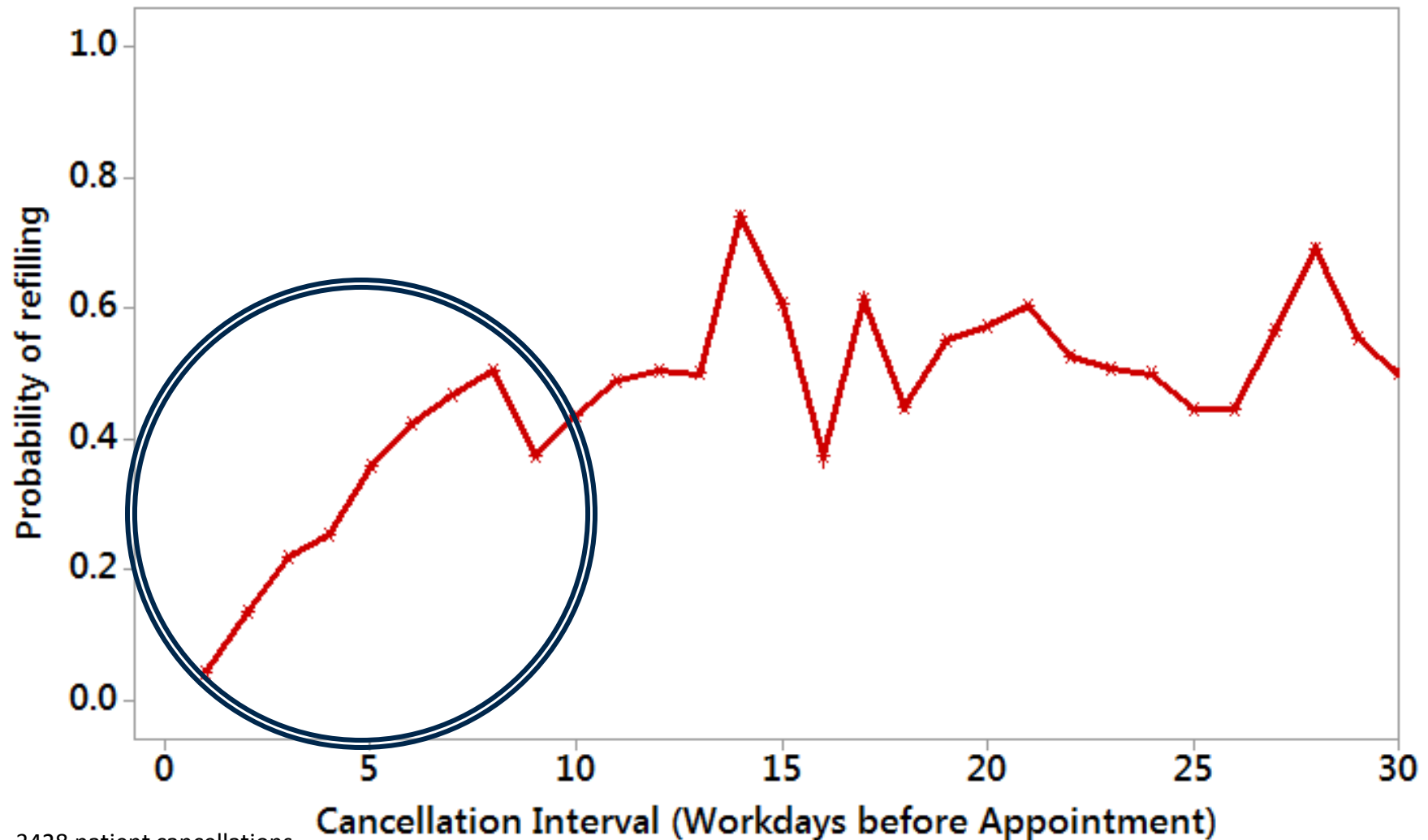
Do emptied slots due to cancellations get refilled?



Results:

## Difficult to refill slots under late cancellations

How likely is an emptied slot refilled after a cancellation?



# Insight from analysis

- No short-term capacity for seeing new patients
- Late cancellations impact utilization of slots

# Future work

- Understand refilling mechanism
  - Waitlist management
- Evaluate effectiveness of current reminder system



# Acknowledgements

- The Metabolism, Endocrinology & Diabetes (MEND) Clinic
- Div. of Endocrinology, Dept. of Internal Medicine,  
University of Michigan Medical School



# Thank you!

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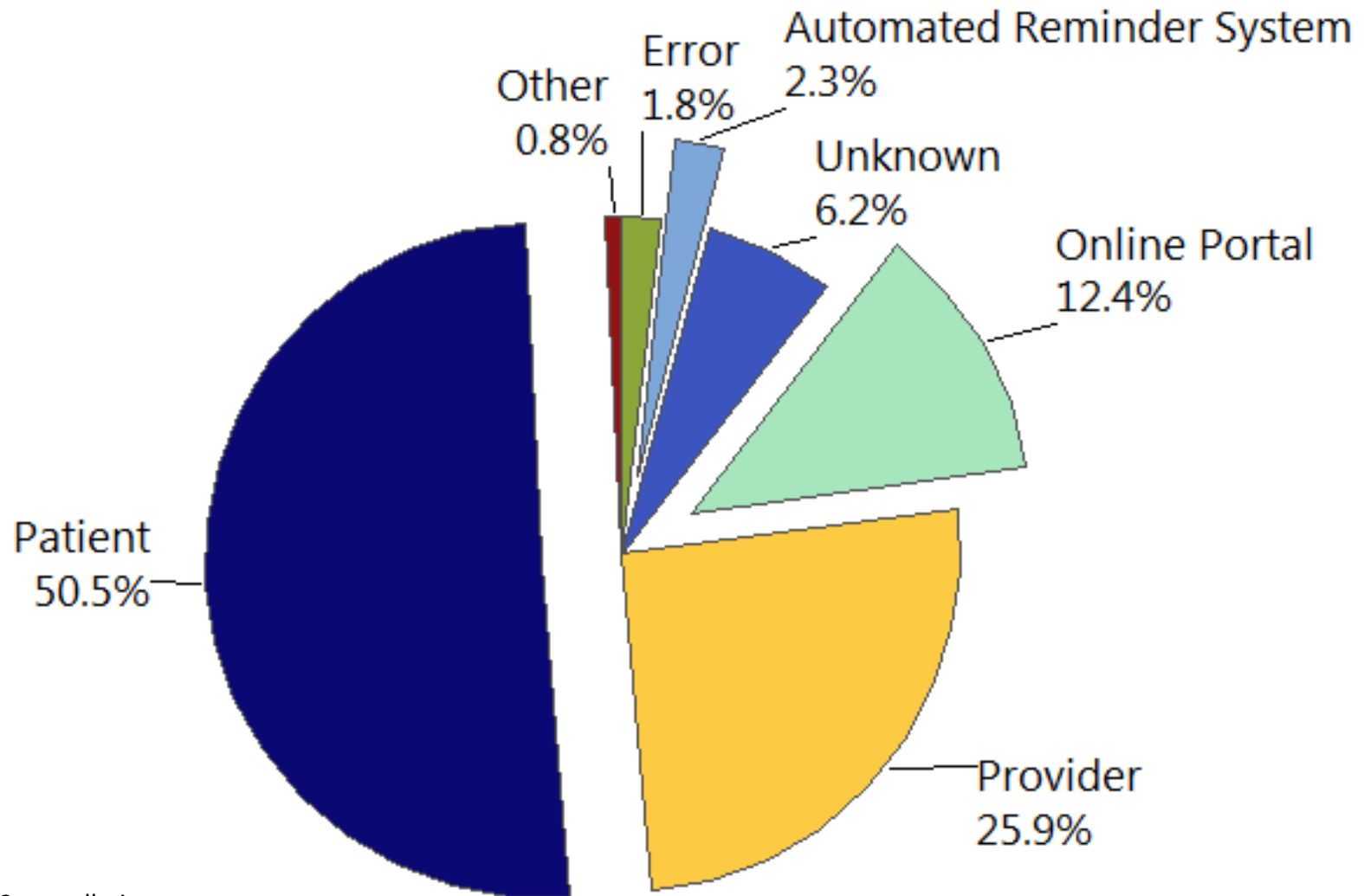
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# Cancellation Reasons

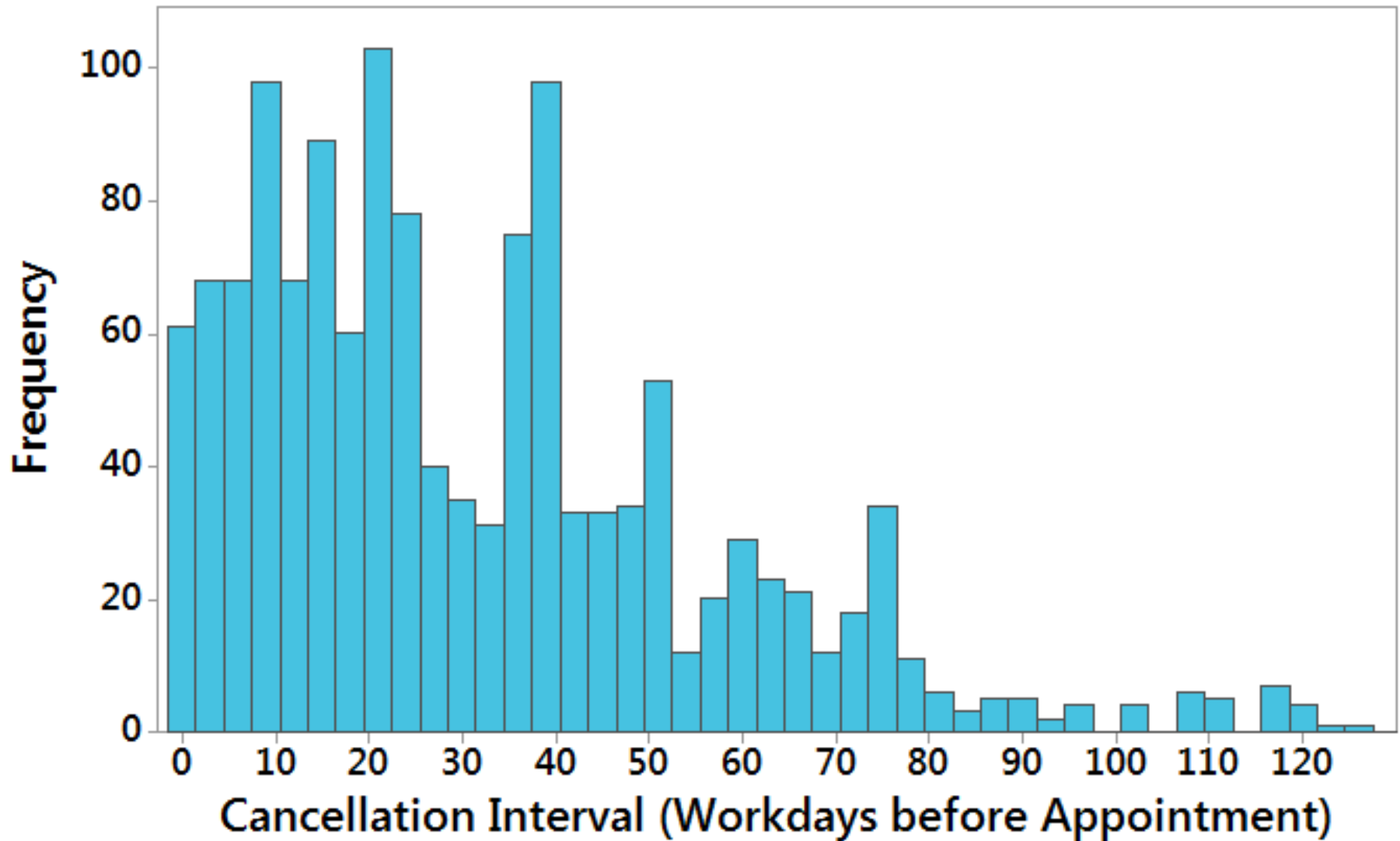


N = 5252 cancellations  
Data from 2014/07/15 to 2016/04/29

# Reschedule of cancellations & Refill of emptied slots

Rescheduled?	Count	Percent	Refilled?	Count	Percent
No	2060	39.22	No	3468	66.03
Yes	3192	60.78	Yes	1784	33.97
N=	5252	100.00	N=	5252	100.00

## How early do provider cancel an appointment?



N = 1358 patient cancellations

Data from 2014/07/15 to 2016/04/29

