



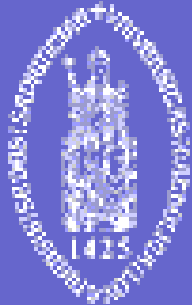
A Markov model for measuring service levels in non-stationary $G(t)/G(t)/s(t)+G(t)$ queues

Stefan Creemers (IESEG)

Mieke Defraeye (KU Leuven)

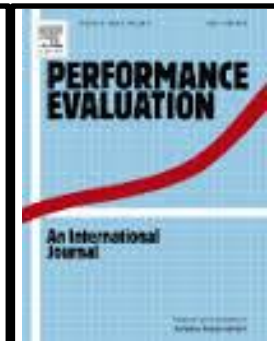
Inneke Van Nieuwenhuyse (KU Leuven)

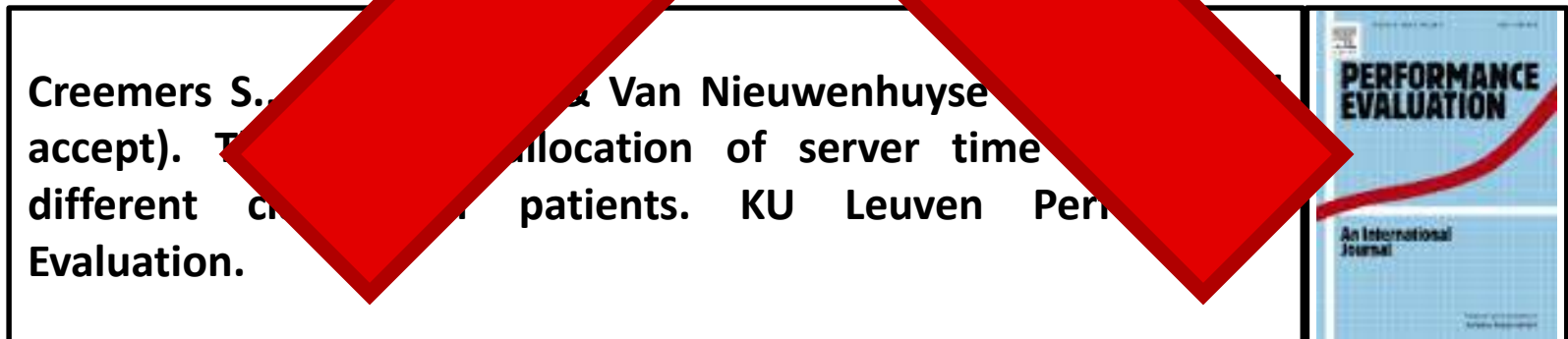
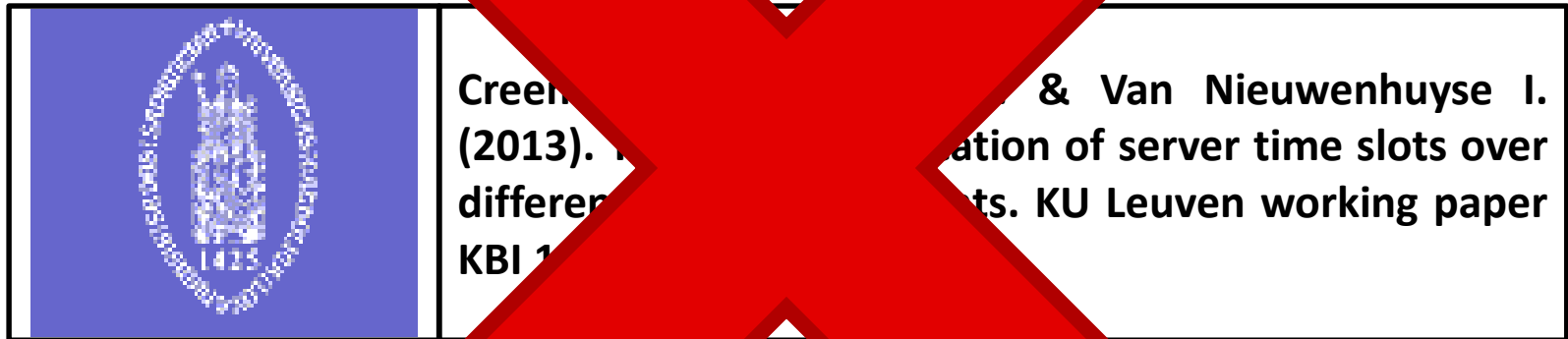
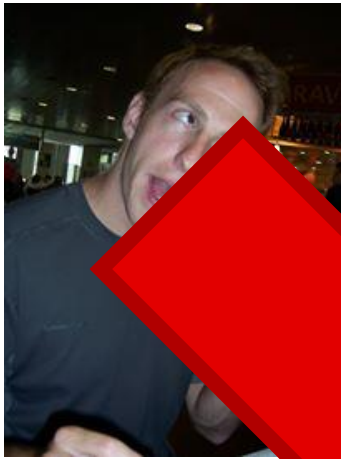




Creemers S., Defraeye M. & Van Nieuwenhuyse I. (2013). The optimal allocation of server time slots over different classes of patients. KU Leuven working paper KBI 1306.

Creemers S., Defraeye M. & Van Nieuwenhuyse I. (conditional accept). The optimal allocation of server time slots over different classes of patients. KU Leuven Performance Evaluation.







The optimal allocation of server time slots over different classes of patients

Stefan Creemers (IESEG)

Jeroen Beliën (HUB)

Marc Lambrecht (KU Leuven)





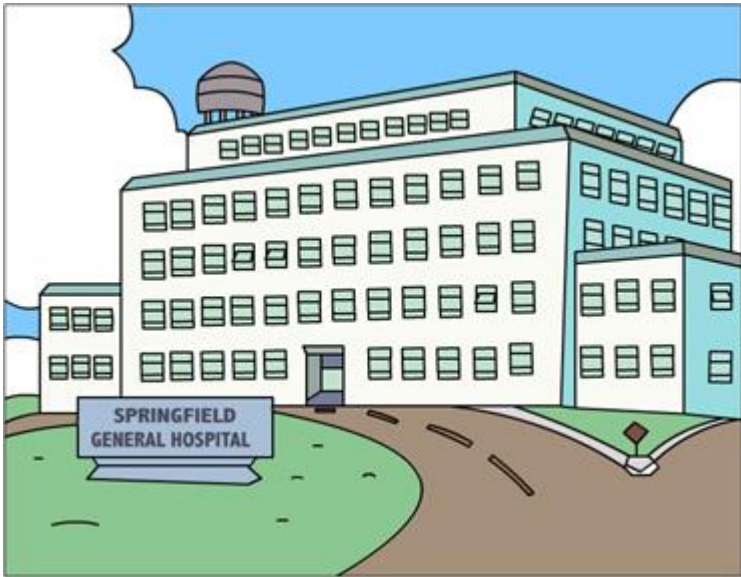
HOSPITAL



HOSPITAL

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



HOSPITAL

**ORTHOPEDIC
SURGERY**

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



HOSPITAL



**ORTHOPEDIC
SURGERY**



**DENTAL
SURGERY**

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



HOSPITAL

**ORTHOPEDIC
SURGERY**

**DENTAL
SURGERY**

**NEUROLOGICAL
SURGERY**

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



HOSPITAL

**ORTHOPEDIC
SURGERY**

**DENTAL
SURGERY**

**NEUROLOGICAL
SURGERY**

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



HOSPITAL



**ORTHOPEDIC
SURGERY**



**DENTAL
SURGERY**



**NEUROLOGICAL
SURGERY**

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



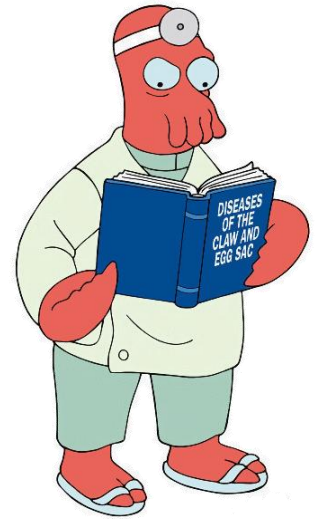
HOSPITAL



**ORTHOPEDIC
SURGERY**



**DENTAL
SURGERY**



**NEUROLOGICAL
SURGERY**

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



HOSPITAL

**ORTHOPEDIC
SURGERY**

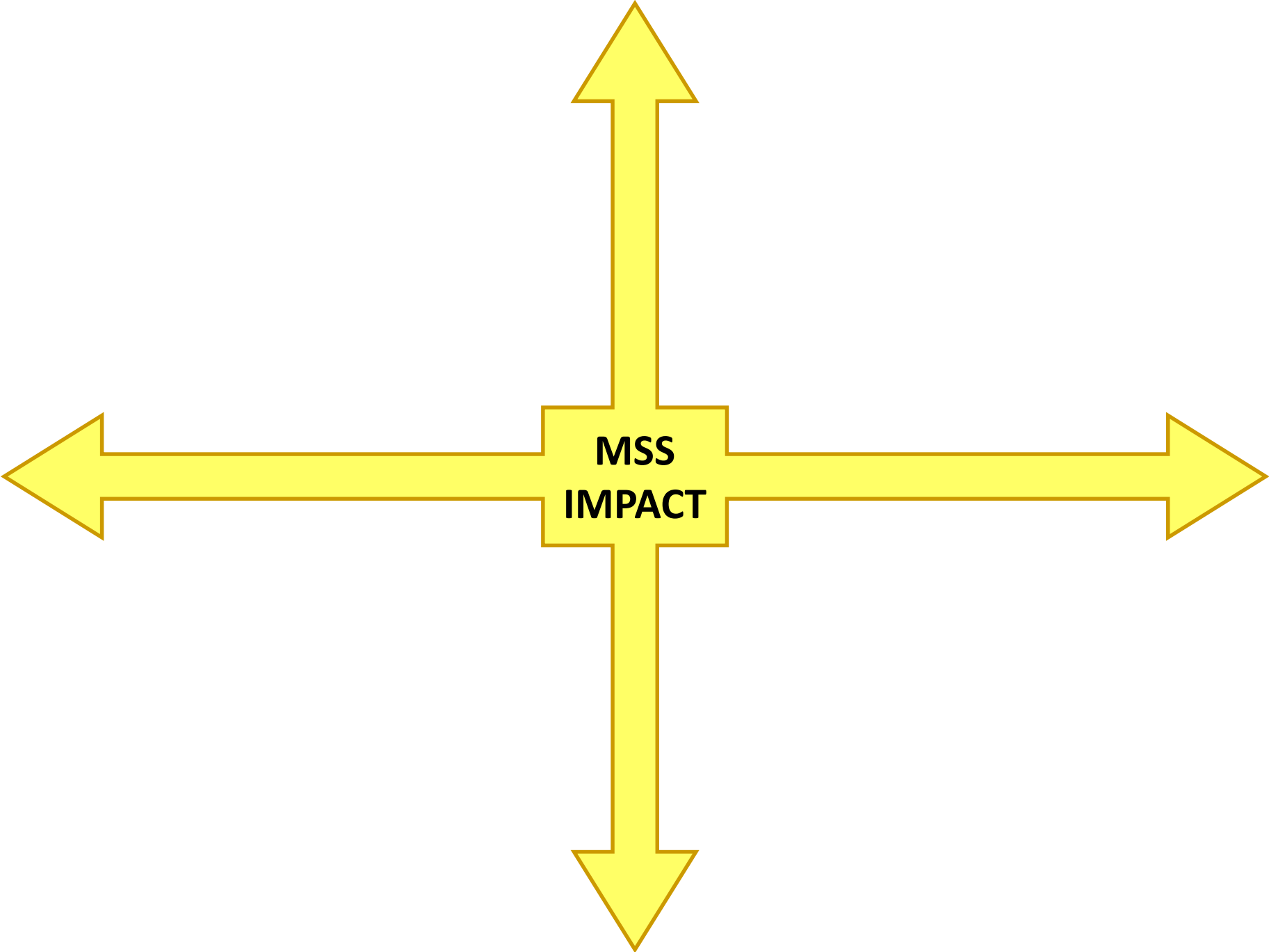
**DENTAL
SURGERY**

**NEUROLOGICAL
SURGERY**

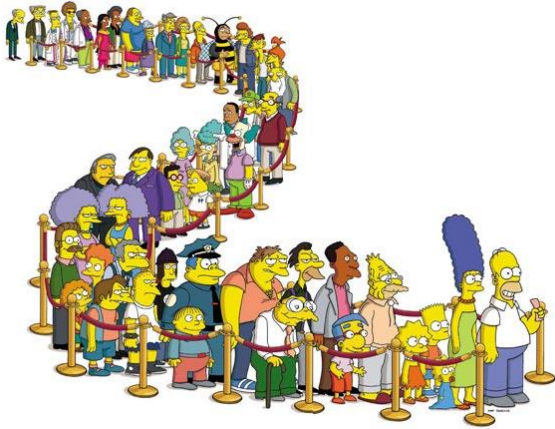
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

MASTER SURGERY SCHEDULE (MSS)

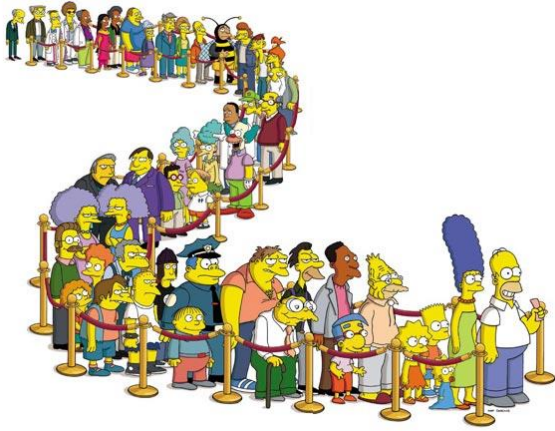


MSS
IMPACT



Patient waiting time / waiting list

**MSS
IMPACT**

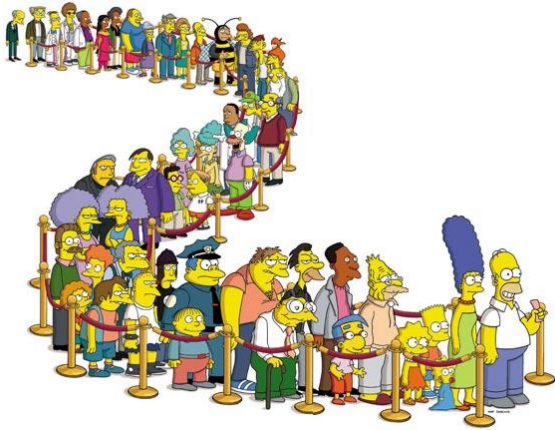


Patient waiting time / waiting list



Staffing /equipment requirements

**MSS
IMPACT**



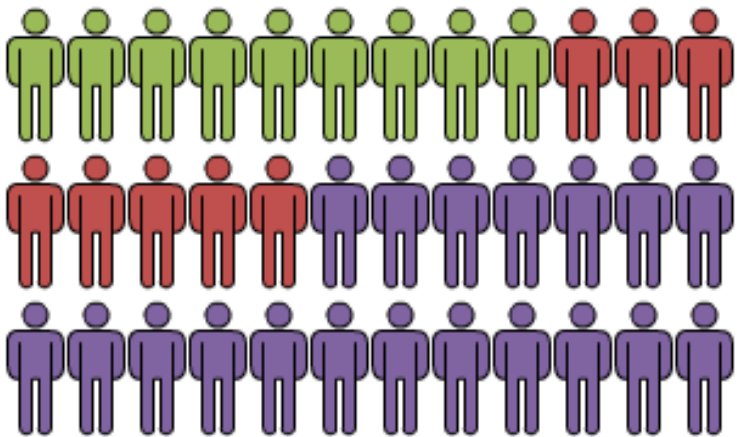
Patient waiting time / waiting list

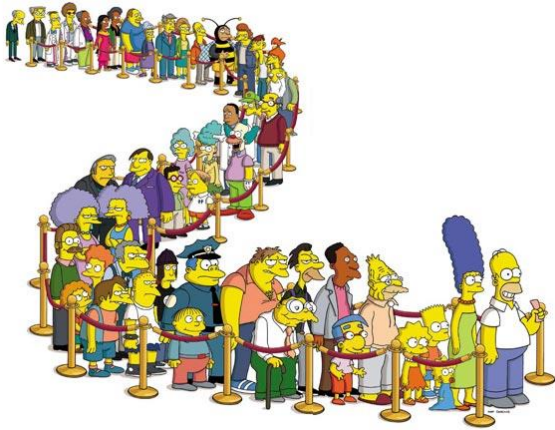


Staffing /equipment requirements

**MSS
IMPACT**

Patient mix





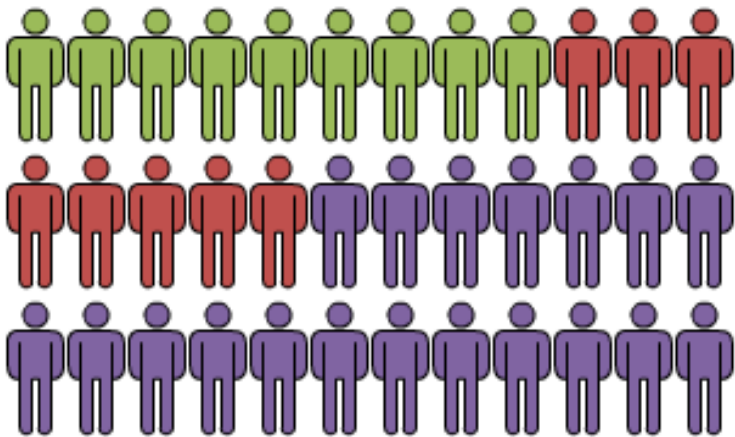
Patient waiting time / waiting list



Staffing /equipment requirements

**MSS
IMPACT**

Patient mix



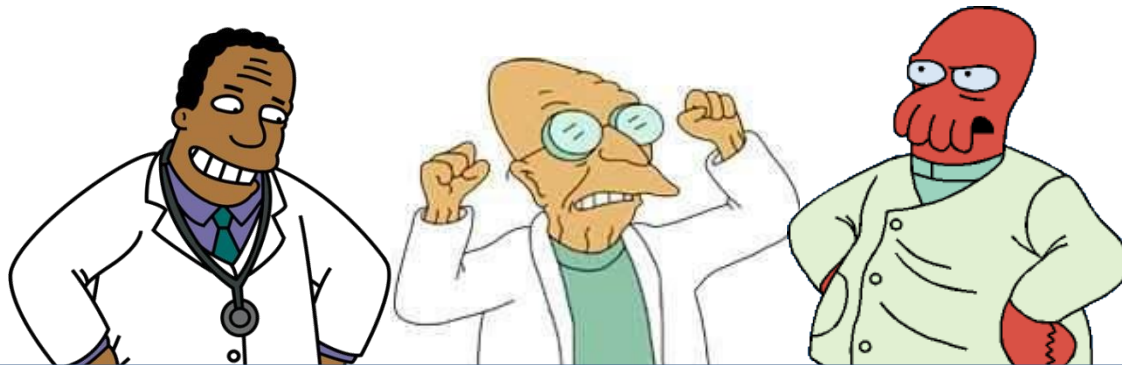
Hospital profitability



**WHO
SETS THE
MSS?**

**WHO
SETS THE
MSS?**

Surgeons ?

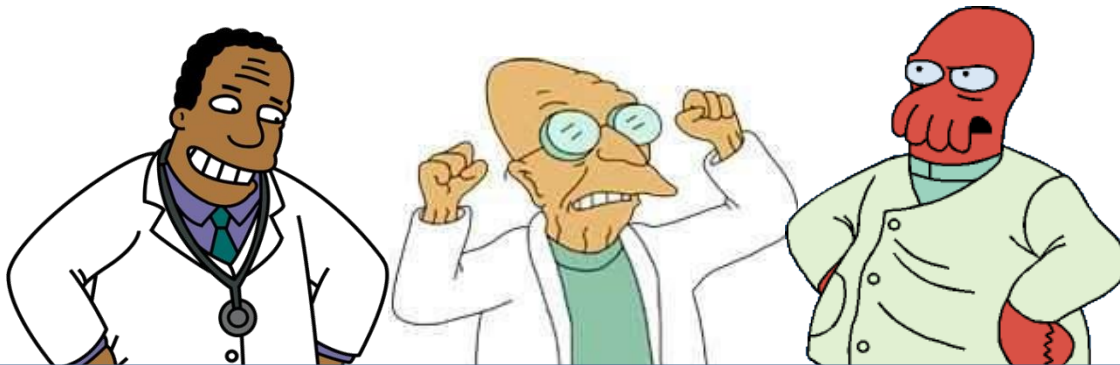


**WHO
SETS THE
MSS?**



Hospital management ??

Surgeons ?



**WHO
SETS THE
MSS?**

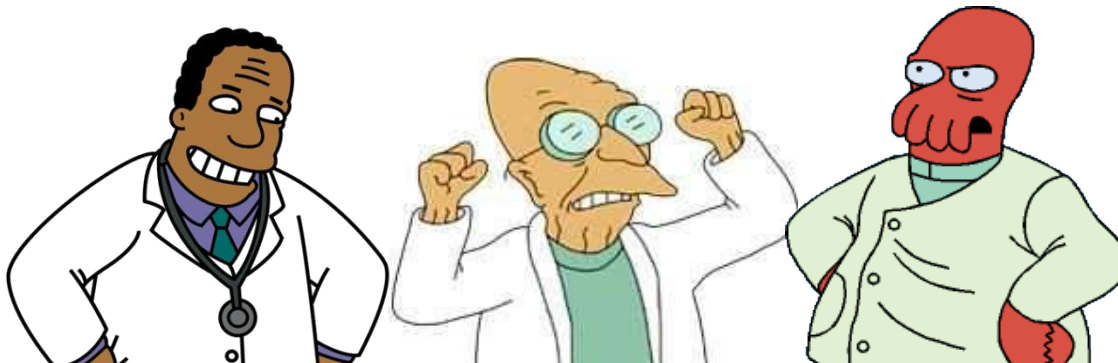


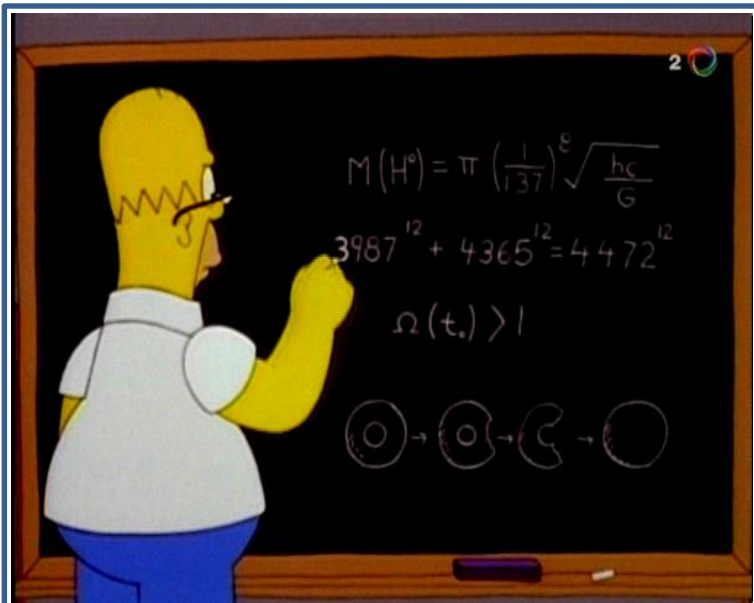
Hospital management ??

The patient ????



Surgeons ?





A mathematical model ???????

**WHO
SETS THE
MSS?**

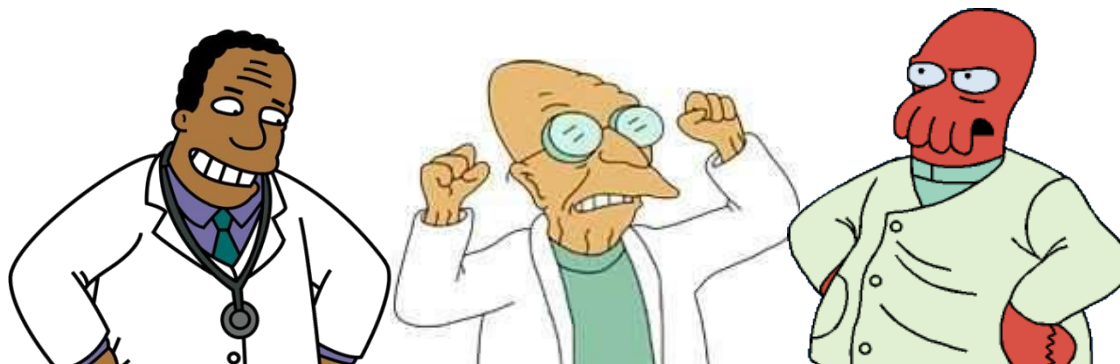


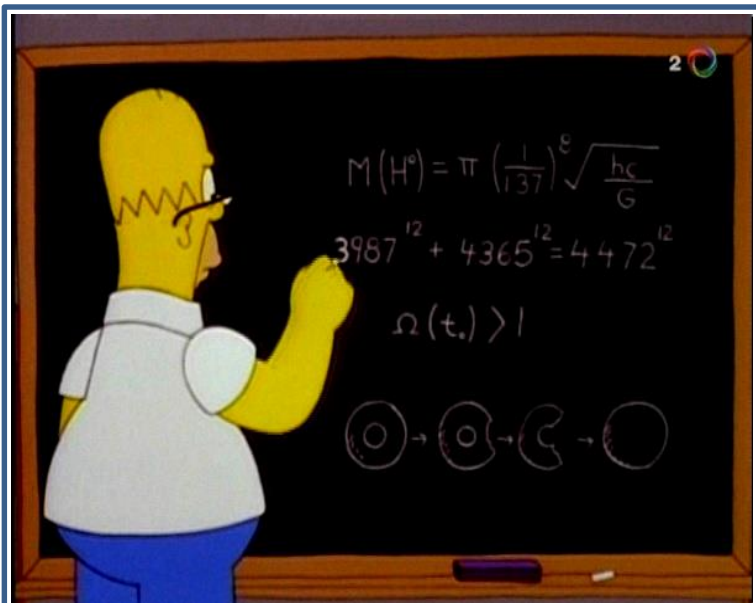
Hospital management ??

The patient ????



Surgeons ?





A mathematical model ???????

**WHO
SETS THE
MSS?**

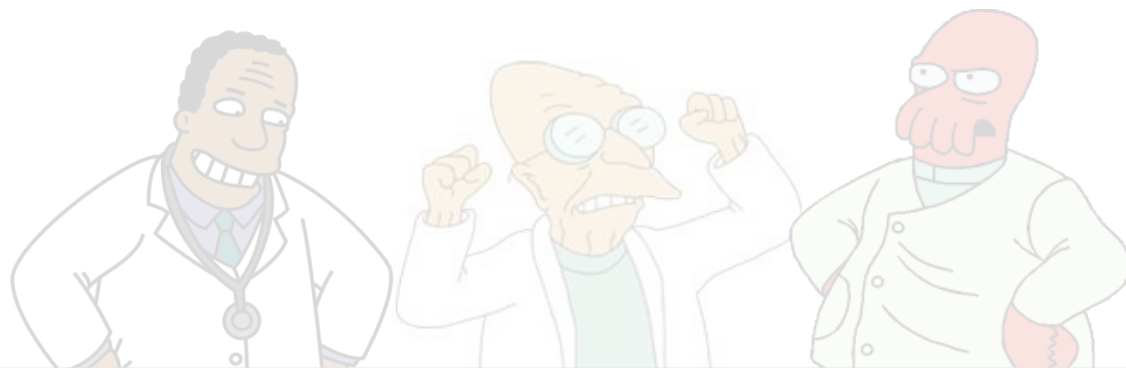


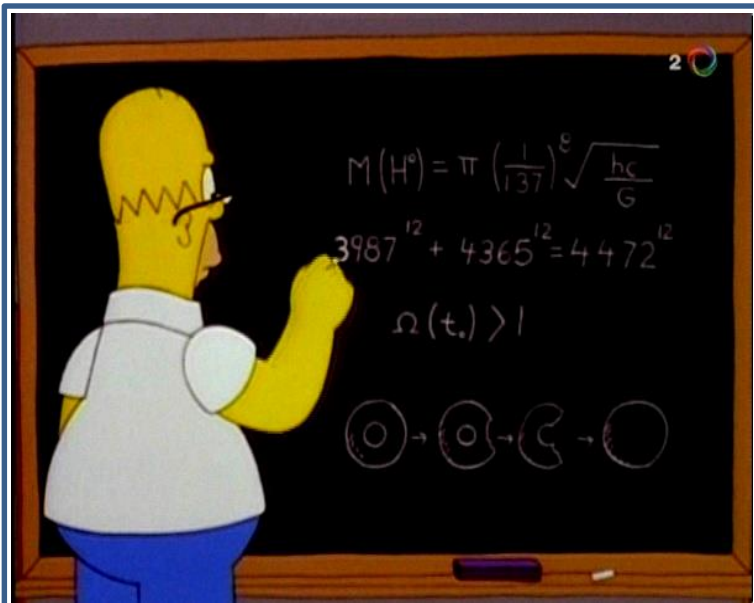
Hospital management ??

The patient ????



Surgeons ?

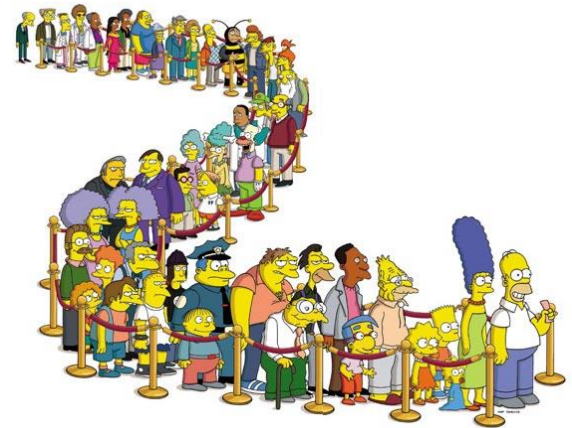




A mathematical model ???????

MINIMIZE

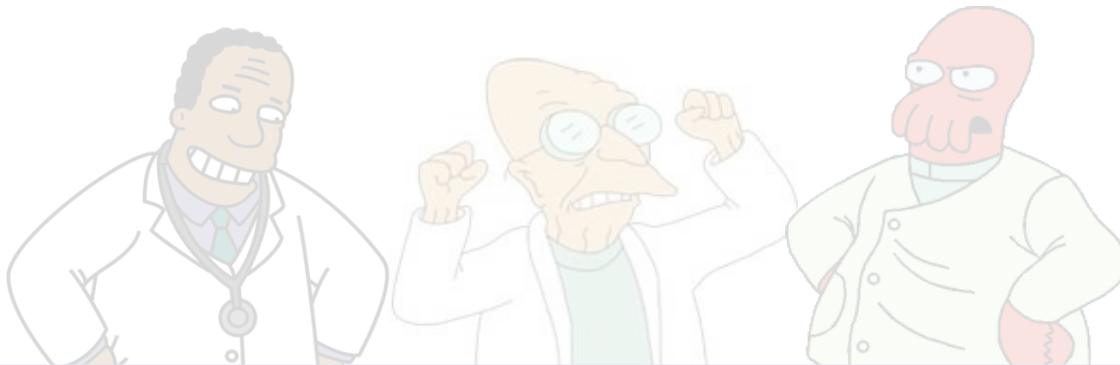
**WHO
SETS THE
MSS?**

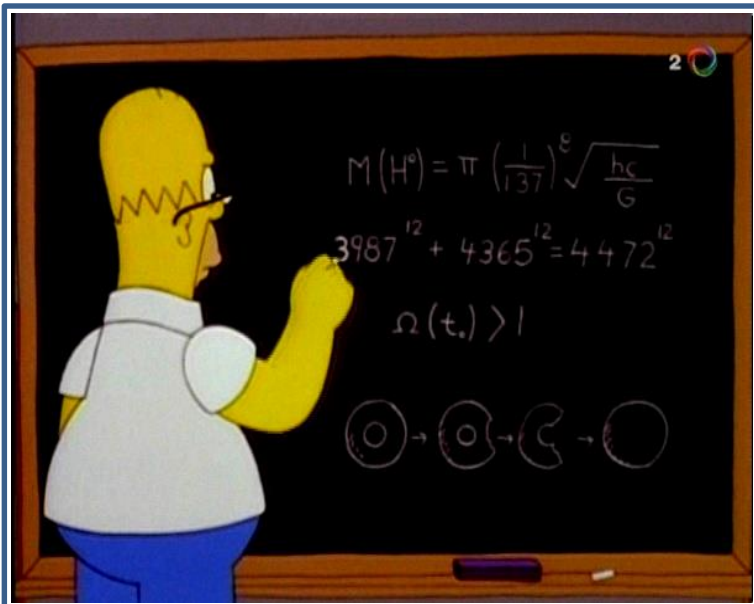


Weighted patient waiting time

The patient ????

Surgeons ?

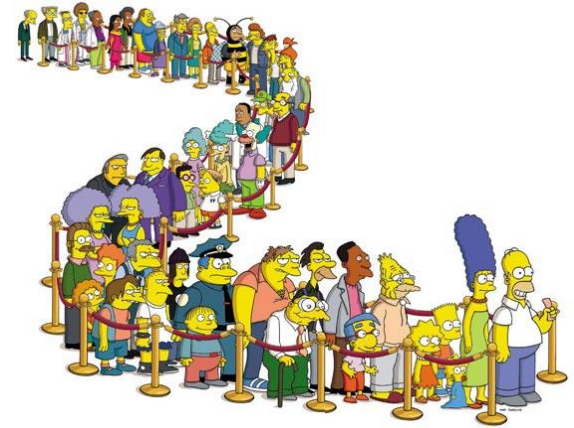




A mathematical model ???????

MINIMIZE

WHO
SETS THE
MSS?



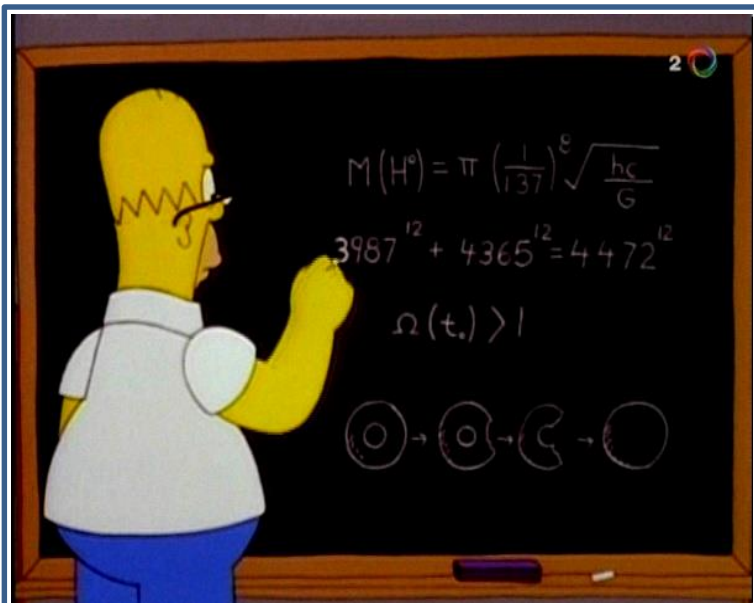
Weighted patient waiting time

The patient ????

McKinsey & Company

41% of US patients choose a hospital based on nonclinical factors (e.g., waiting time, ease of making an appointment etc.)

75% of patients are willing to switch hospitals based on the timely conduction of scheduled appointments

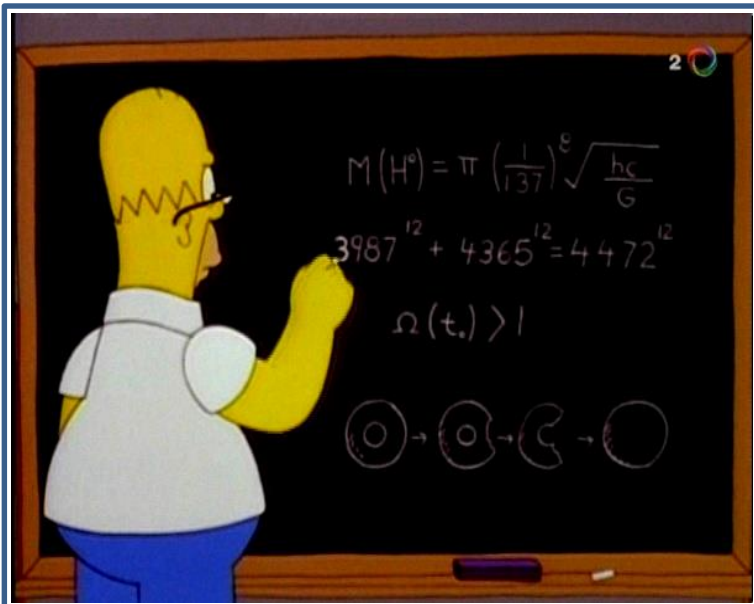


A mathematical model ???????



OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



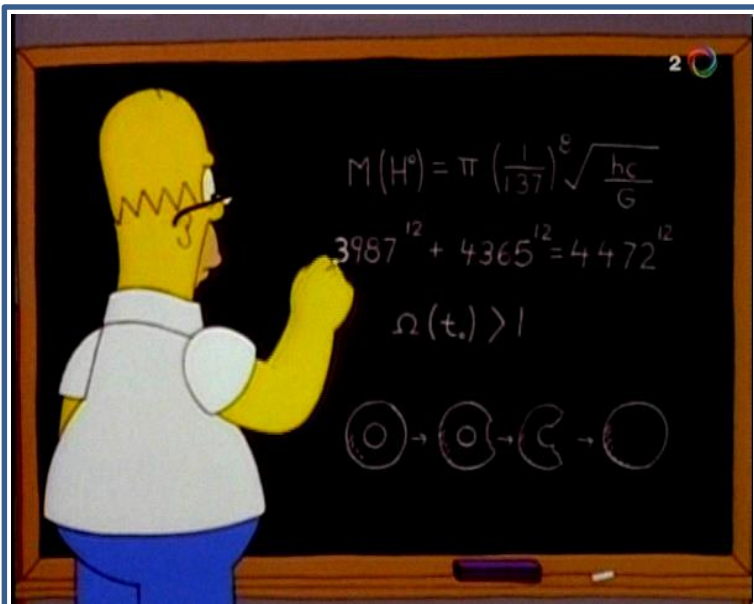
A mathematical model ???????

Any given MSS or
block allocation

OPERATING THEATRE 1							OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN



Markov model



A mathematical model ???????

Any given MSS or block allocation

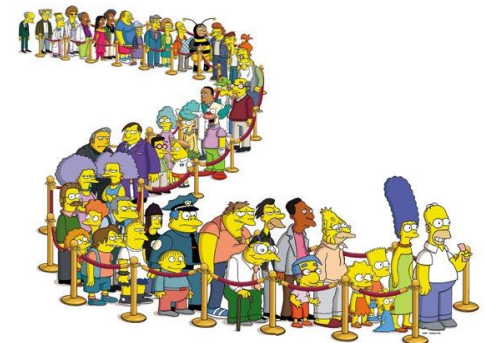
OPERATING THEATRE 1							OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN

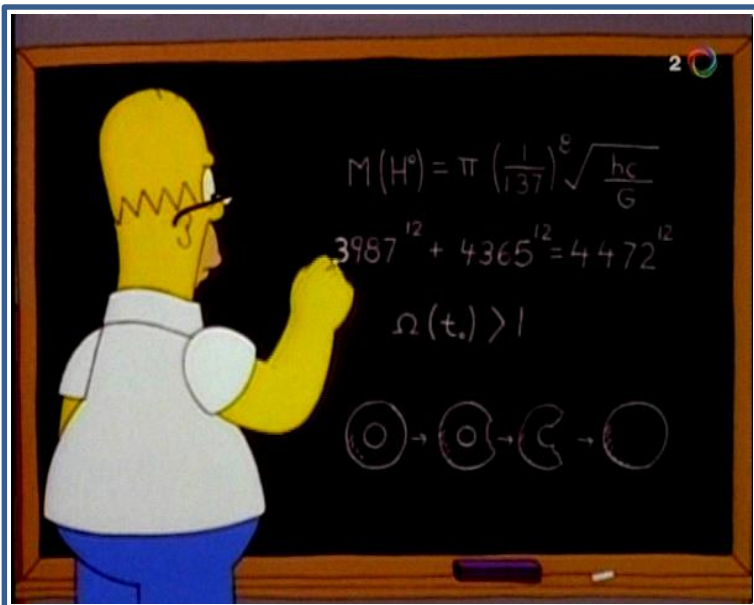


Markov model



Waiting time for each patient type





A mathematical model ???????

Optimization procedure generates
MSS until optimal weighted
patient time has been found

Any given MSS or
block allocation

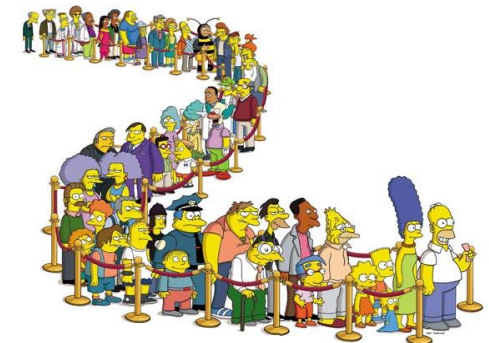
OPERATING THEATRE 1							OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN

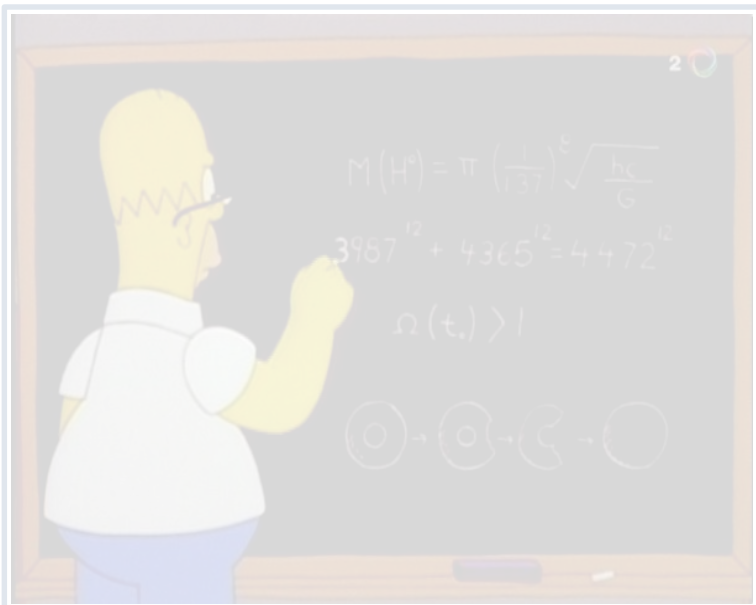


Markov model



Waiting time for
each patient type





A mathematical model ???????



Any given MSS or
block allocation

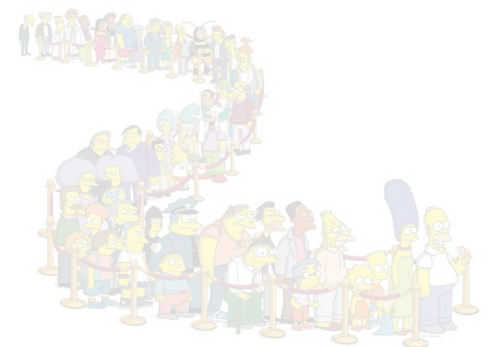
OPERATING THEATRE 1							OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN



Markov model



Waiting time for
each patient type



Optimization procedure generates
MSS until optimal weighted
patient time has been found



ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

ORTHOPEDICS

WAITING LIST (ORTHOPEDICS)



WAITING LIST (ORTHOPEDICS)



WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45








OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)










WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...



WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45

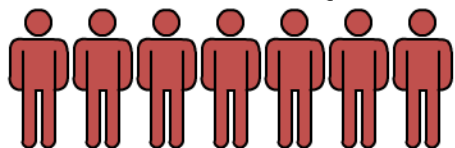
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN













WAITING LIST (**ORTHOPEDICS**)





WAITING LIST (**DENTIST**)















WEEK 1



OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...






WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

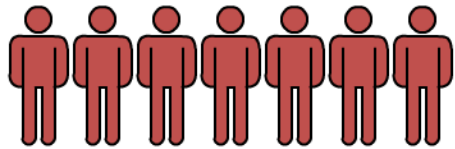
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)















WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...






WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

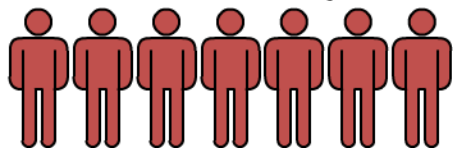
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



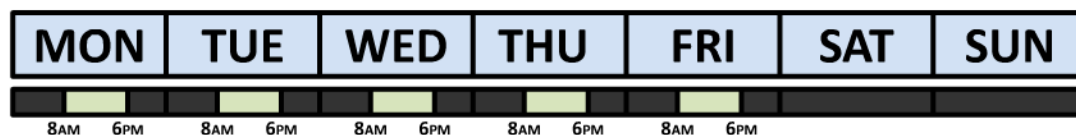
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (ORTHOPEDICS)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...






WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

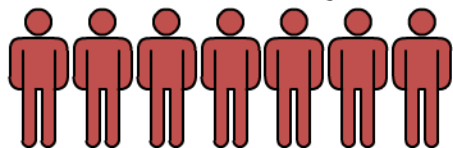
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



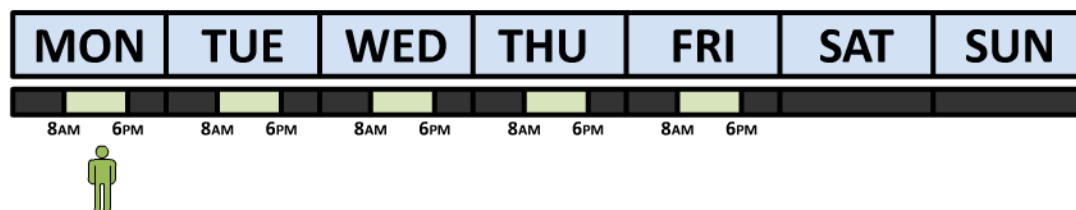
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (ORTHOPEDICS)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...






WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

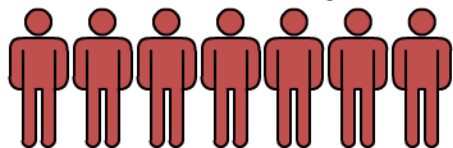
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



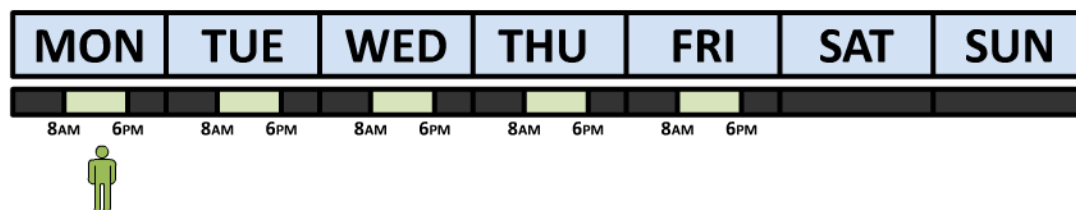
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (ORTHOPEDICS)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...







WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



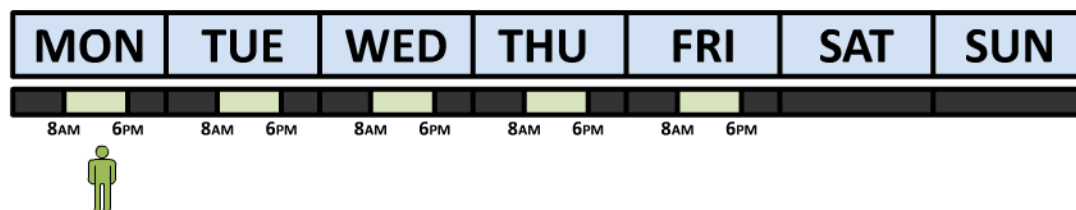
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (ORTHOPEDICS)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...







WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

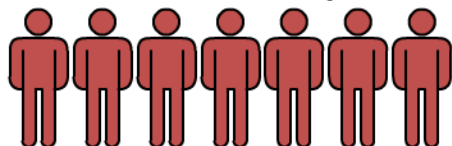
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



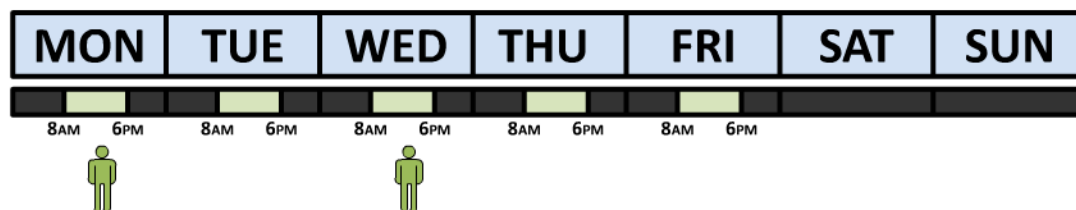
WAITING LIST (DENTIST)



WAITING LIST (NEUROLOGY)



WEEK 1: PATIENT ARRIVAL (ORTHOPEDICS)



WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45

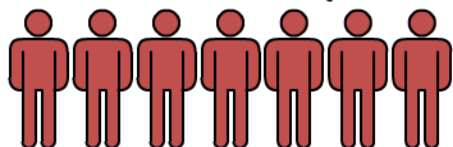
OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



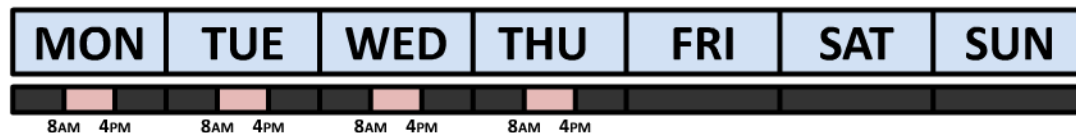
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (DENTIST)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...








WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



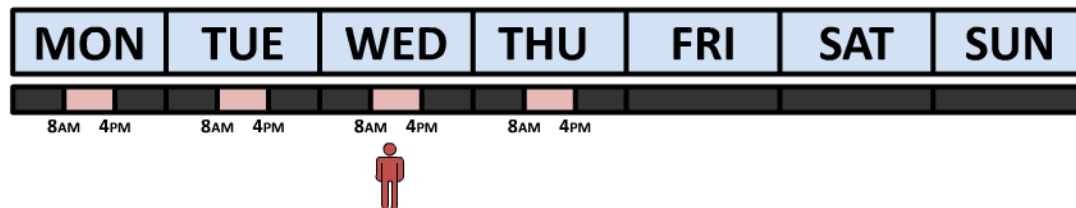
WAITING LIST (DENTIST)



WAITING LIST (NEUROLOGY)



WEEK 1: PATIENT ARRIVAL (DENTIST)



WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



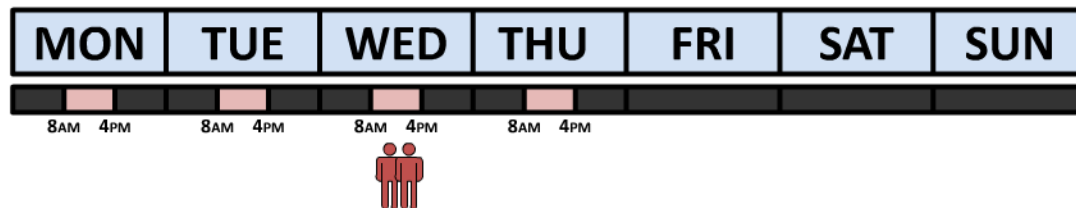
WAITING LIST (DENTIST)



WAITING LIST (NEUROLOGY)



WEEK 1: PATIENT ARRIVAL (DENTIST)



WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



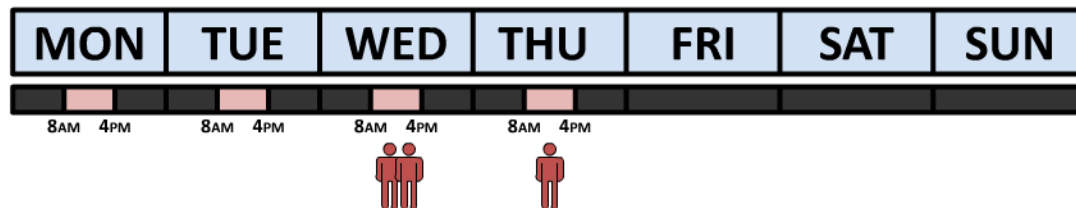
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (DENTIST)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...










WEEK 34


OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						

WAITING LIST (ORTHOPEDICS)



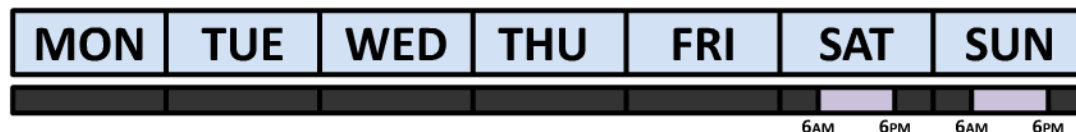
WAITING LIST (DENTIST)















WAITING LIST (NEUROLOGY)















WEEK 1: PATIENT ARRIVAL (NEUROLOGY)















WEEK 1






OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...










WEEK 34


OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN
						
						

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN
						

WAITING LIST (ORTHOPEDICS)



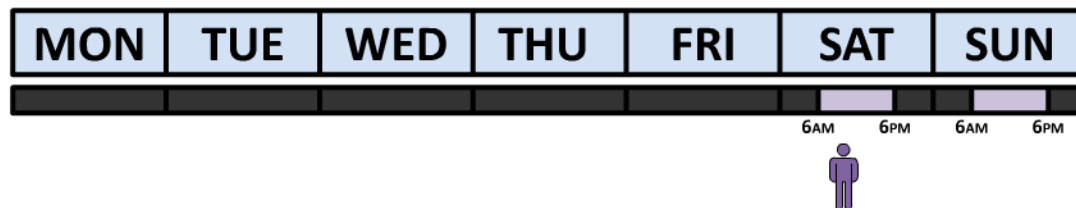
WAITING LIST (DENTIST)



WAITING LIST (NEUROLOGY)



WEEK 1: PATIENT ARRIVAL (NEUROLOGY)



WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

WAITING LIST (ORTHOPEDICS)



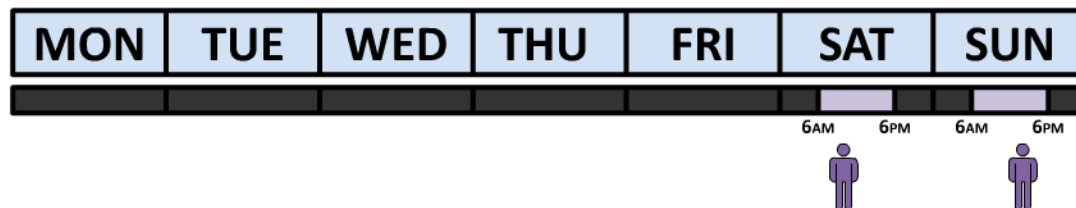
WAITING LIST (DENTIST)



WAITING LIST (NEUROLOGY)



WEEK 1: PATIENT ARRIVAL (NEUROLOGY)



WEEK 1

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 34

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

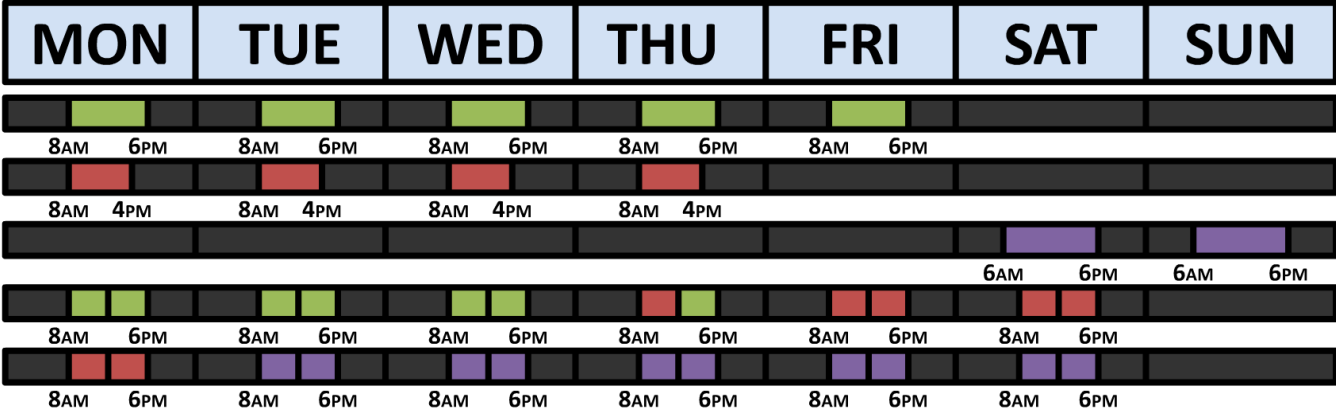
OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN

...

WEEK 45

OPERATING THEATRE 1						
MON	TUE	WED	THU	FRI	SAT	SUN

OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN



PATIENT ARRIVAL (ORTHOPEDICS)

PATIENT ARRIVAL (DENTIST)

PATIENT ARRIVAL (NEUROLOGY)

OPERATING THEATRE 1

OPERATING THEATRE 2

Naïve approach requires 4 dimensions

- 1. The number of patients in queue for each patient type**
- 2. The phase of the arrival process for each patient type (we allow general interarrival times)**
- 3. The current system state (i.e., what events can take place?)**
- 4. The phase of the process that keeps track of system state transitions**

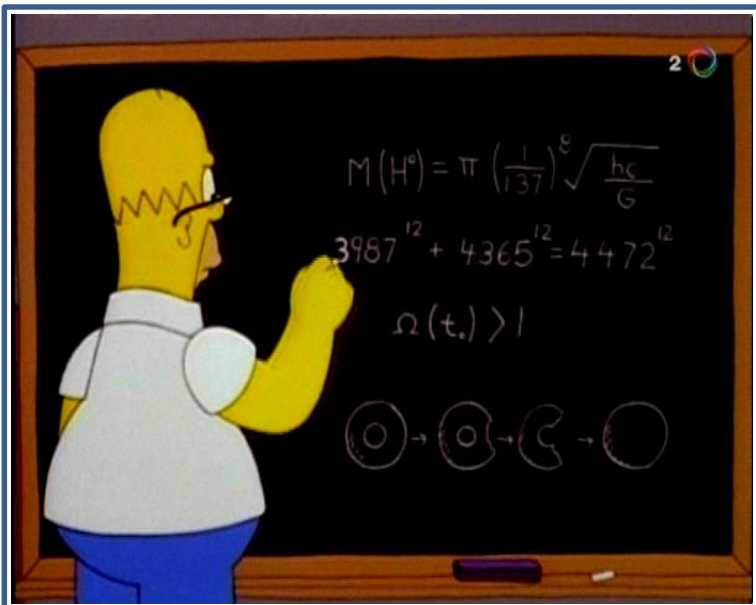
Naïve approach requires 4 dimensions

1. The number of patients in queue for each patient type
2. The phase of the arrival process for each patient type (we allow general interarrival times)
3. The current system state (i.e., what events can take place?)
4. The phase of the process that keeps track of system state transitions

Our approach

1. Uses sets of two-dimensional Markov chains.
 2. Very fast!
 3. Exact!
- => Can be used for optimization purposes!





A mathematical model ???????

Optimization procedure generates
MSS until optimal weighted
patient time has been found

Any given MSS or
block allocation

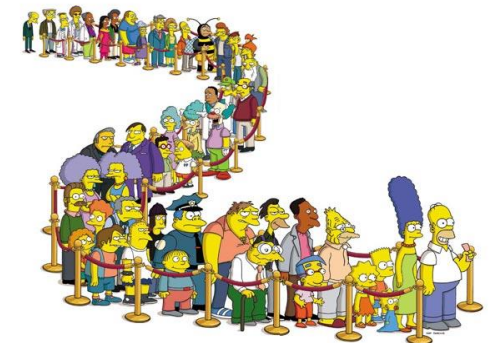
OPERATING THEATRE 1							OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN

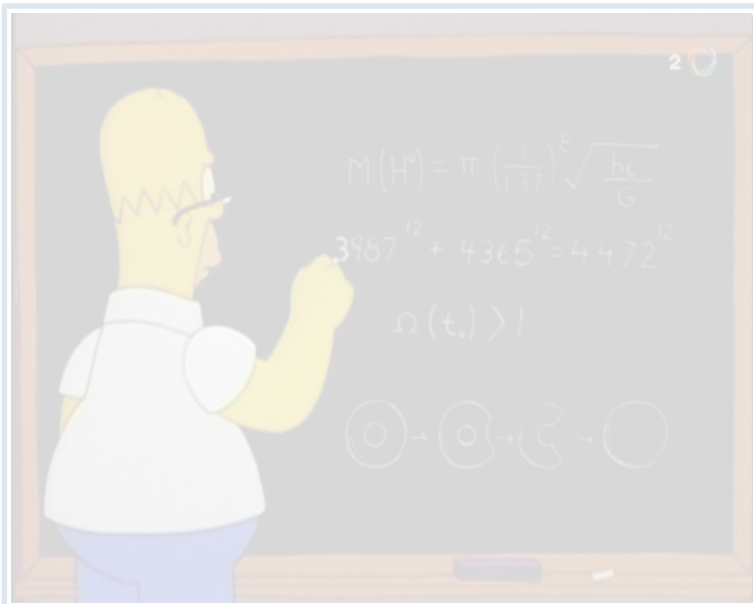


Markov model



Waiting time for
each patient type





A mathematical model ???????



Any given MSS or
block allocation

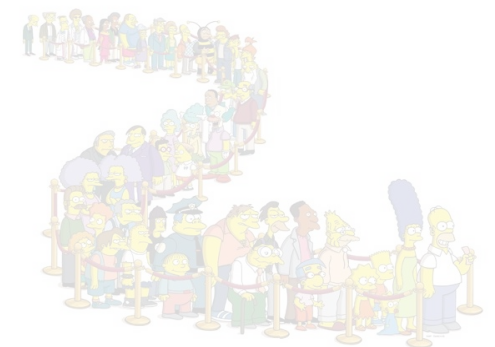
OPERATING THEATRE 1							OPERATING THEATRE 2						
MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN



Markov model



Waiting time for
each patient type



Optimization procedure generates
MSS until optimal weighted
patient time has been found



Optimal procedure for small problems

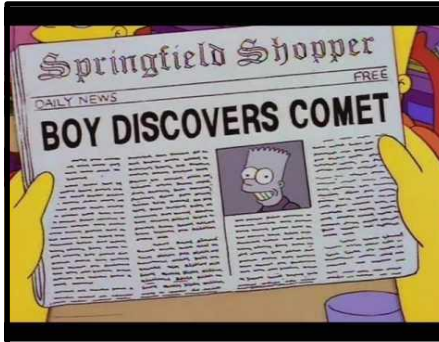


Step-wise heuristic for large problems





Creemers S., Beliën J. & Lambrecht M. (2012). The optimal allocation of server time slots over different classes of patients. European Journal of Operational Research, 219(3), pp. 508-521.

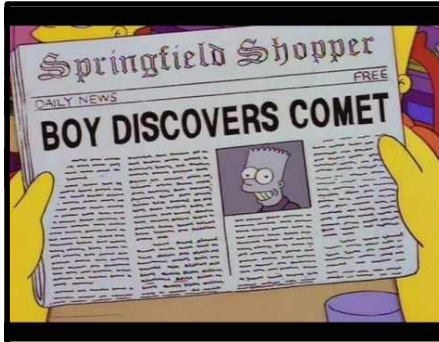


Creemers S., Beliën J. & Lambrecht M. (2012). The optimal allocation of server time slots over different classes of patients. *European Journal of Operational Research*, 219(3), pp. 508-521.

Contribution

We developed a new queueing model that allows to identify the optimal block allocation such that the weighted patient waiting time is minimized





Creemers S., Beliën J. & Lambrecht M. (2012). The optimal allocation of server time slots over different classes of patients. *European Journal of Operational Research*, 219(3), pp. 508-521.

Contribution

We developed a new queueing model that allows to identify the optimal block allocation such that the weighted patient waiting time is minimized



Future research

1. Also observe what happens during service itself => include server idle time, overtime etc.
2. Add additional constraints (staffing/equipment)



