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## MASSIVELY MULTIPLAYER ONLINE GAMING ON LARGE SCALE SYSTEMS

6/11/2018

www.aau.at



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# Introduction

- Alpen-Adria-Universität Klagenfurt
- University professor for Distributed Systems
- Institute of Information Technology
  - Over 20 scientific, technical and administrative members
  - 2 full professors, 3 associate professors
  - <http://itec.aau.at/>



# Klagenfurt am Wörthersee



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# 2016-2020 GLOBAL GAMES MARKET

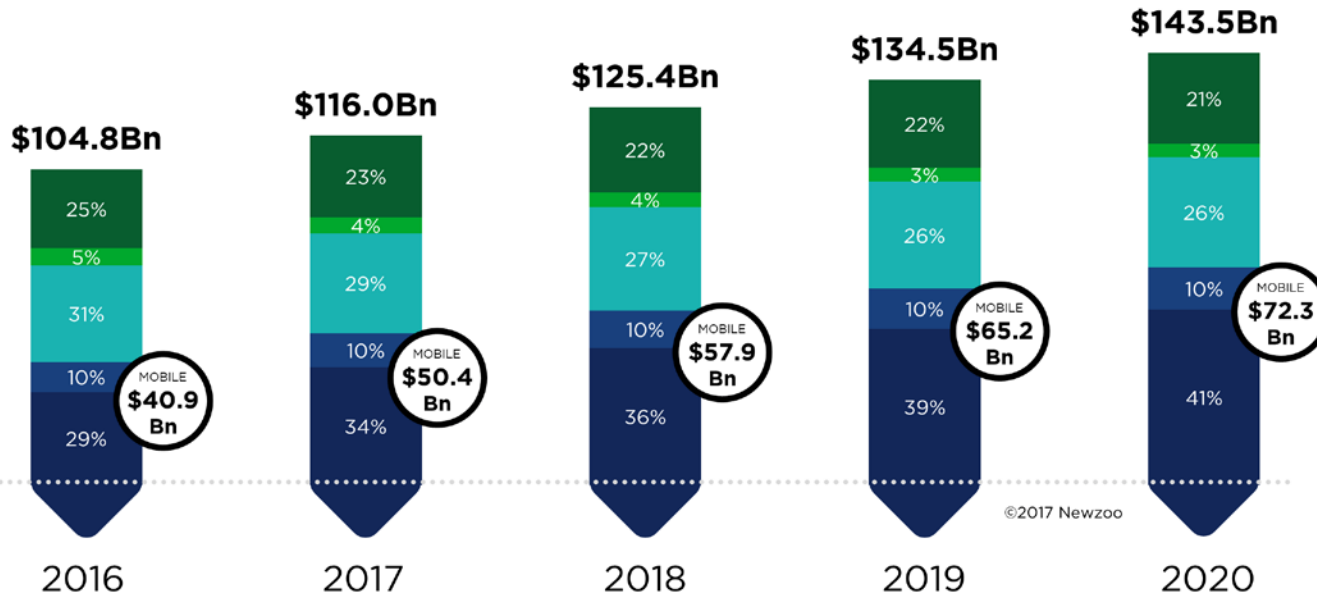
FORECAST PER SEGMENT TOWARD 2020

TOTAL MARKET

**+8.2%**

CAGR 2016-2020

● Boxed/Downloaded PC ● Browser PC ● Console ● Tablet ● Smartphone



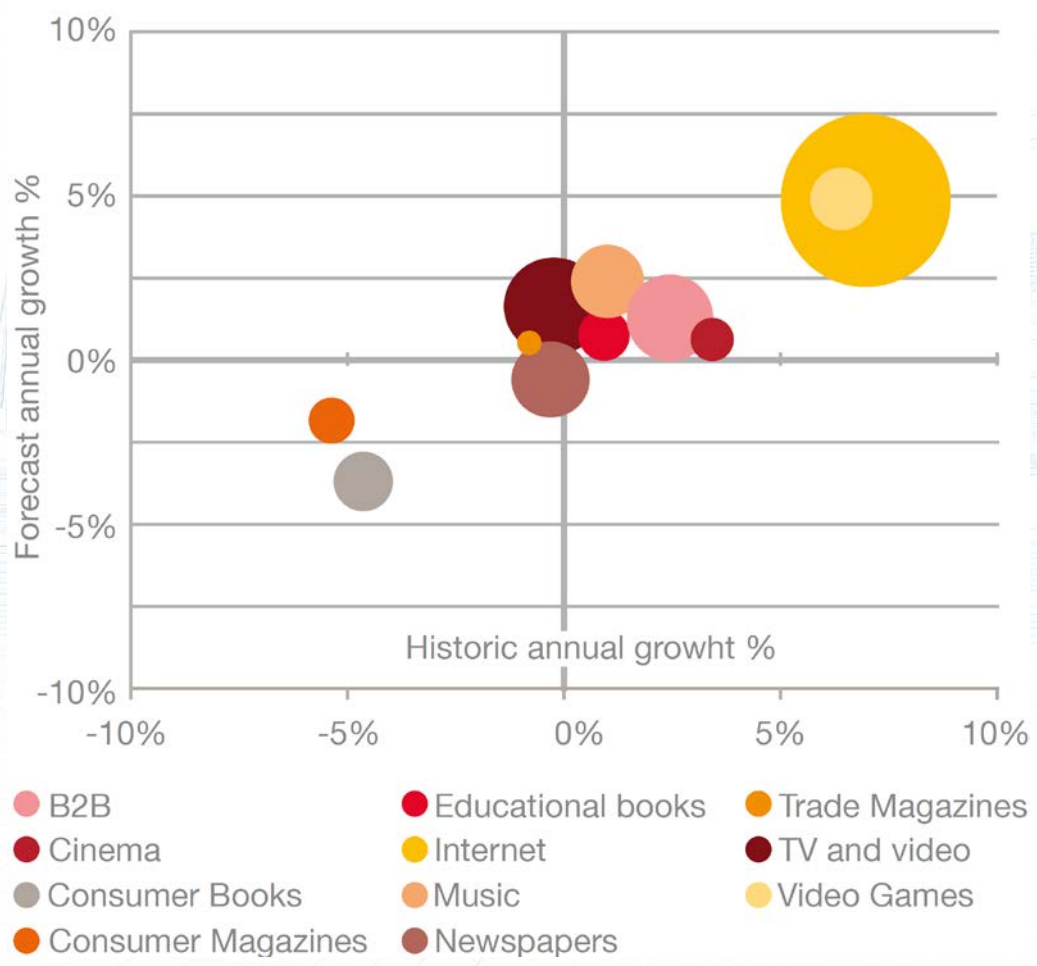
©2017 Newzoo

Source: ©Newzoo | Q4 2017 Update | Global Games Market Report  
newzoo.com/globalgamesreport



# Entertainment and Media in Netherlands

**E&M consumer spending by sector (€ millions)**



# THE DUTCH GAMES MARKET

## KEY 2016 FACTS

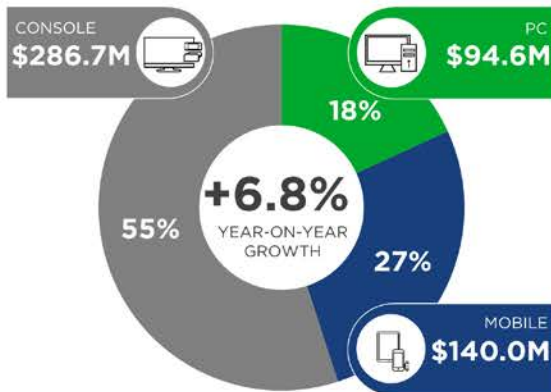
TOTAL  
GAME REVENUES

**\$521.3M**



### REVENUES PER SEGMENT

SHARE AND IN \$M FOR 2016



**16.1**  
MILLION



**ONLINE  
POPULATION**

**43%**

OF THE ONLINE  
POPULATION  
PLAY GAMES

**6.9**  
MILLION



**ALL  
GAMERS**

**51%**

OF ALL GAMERS  
SPEND MONEY

**3.5**  
MILLION



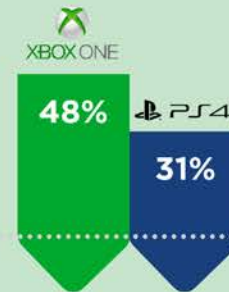
**PAYING  
GAMERS**

**\$148**

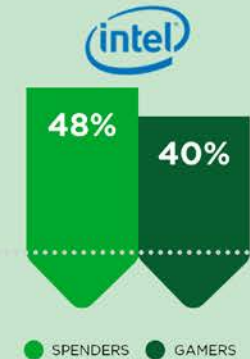
WILL BE SPENT PER  
PAYING GAMER ON  
AVERAGE IN 2016



**SHARE PLAYS RACE  
GAMES ON CONSOLE**  
XBOX ONE VS.  
PLAYSTATION 4 OWNERS



**BRAND ATTITUDE**  
POSITIVE BRAND ATTITUDE  
INTEL: GAMERS VS. SPENDERS



### GLOBAL VIEW

GLOBAL GAMES  
MARKET REPORT  
(QUARTERLY)  
\$6,900/YR



### COUNTRY INSIGHTS

CONSUMER GAMER  
INSIGHTS (200  
VARIABLES)  
\$5,000/YR



# MMOG Genres

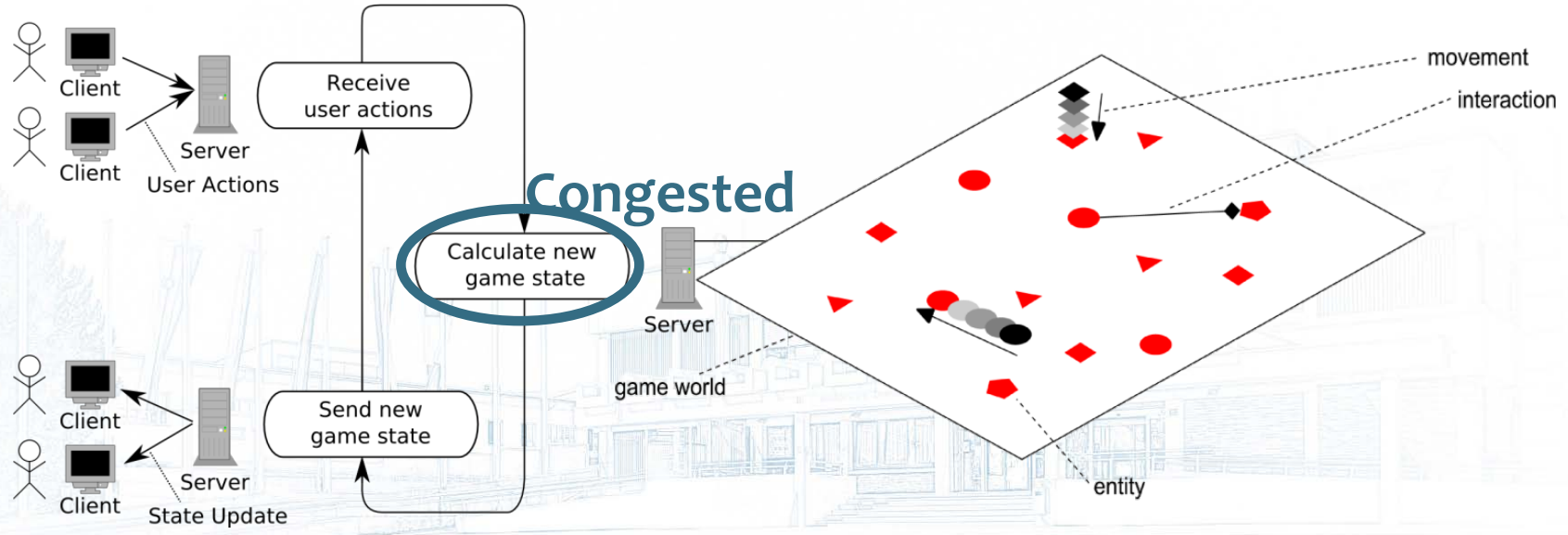
- Massively Multiplayer Online Role Playing Games (MMORPG)
  - Adventure games
  - World of Warcraft, Eve Online, Second Life, RunScape, ...
  - Thousands of players sharing one game session in a huge persistent game world
  
- First Person Shooter (FPS)
  - Action games
  - Counter Strike, Battlefield, Doom, Quake, ...
  - Few hundreds players in one ephemeral session
  
- Real-Time Strategy (RTS)
  - Economic and battle strategy games
  - Starcraft, Empire: Total War, Age of Empires, Dune II, ...



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# MMO Game Computational Model

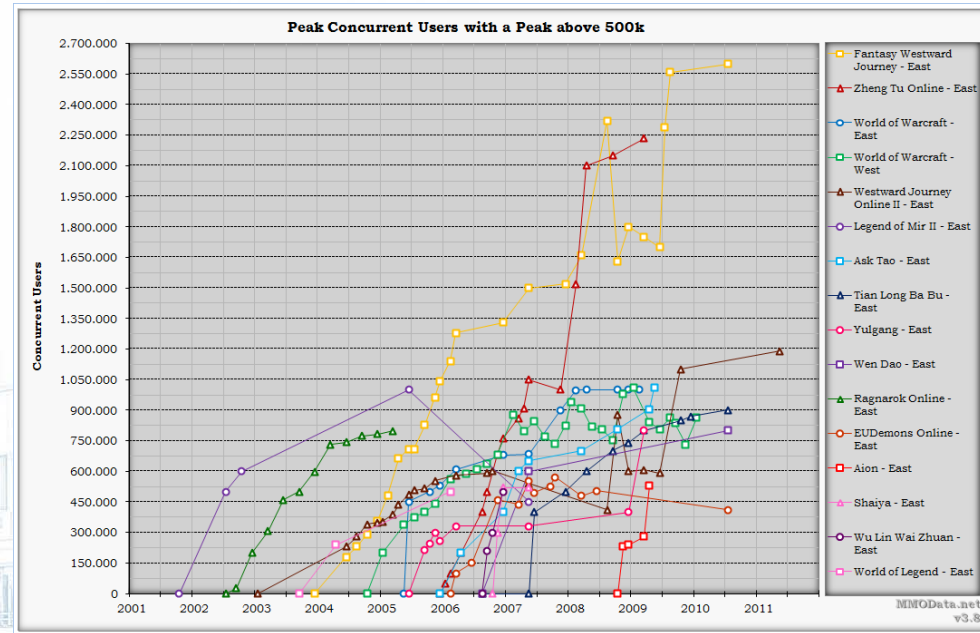


- **Real-time server loop**
  - Up to 100 Hz depending on game type
- **Number and density of players** in a game session generates **load** that congest servers

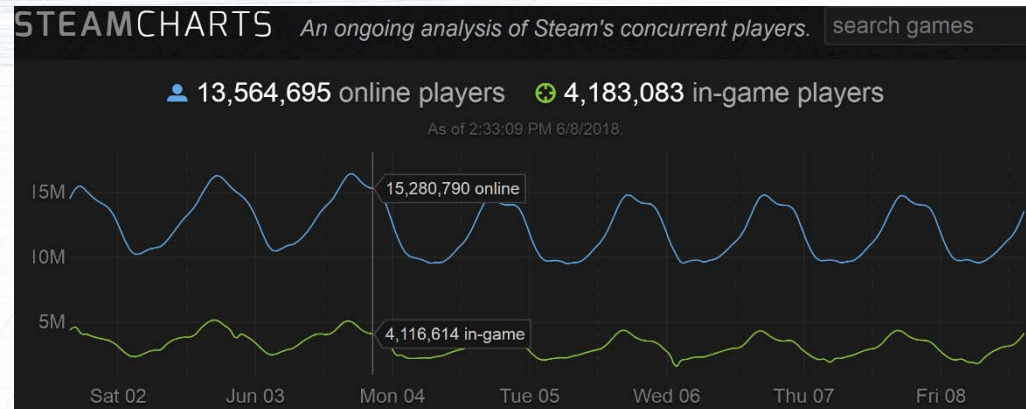


# MMOG Load

- Long-term demand
  - <http://mmodata.blogspot.co.at/>
  - MMOG providers operate large data centres



- Short-term demand
  - <http://steamcharts.com/>
  - Resource overprovisioning



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# MMOOG Software Stack

Service Level Agreements

QoS fault tolerance

Resource provisioning

Load modelling

**Parallelisation**

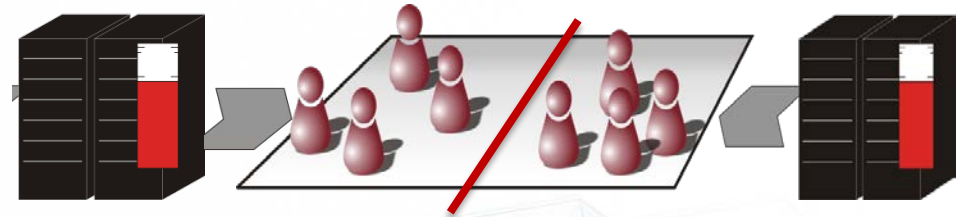




# Game Server Parallelisation

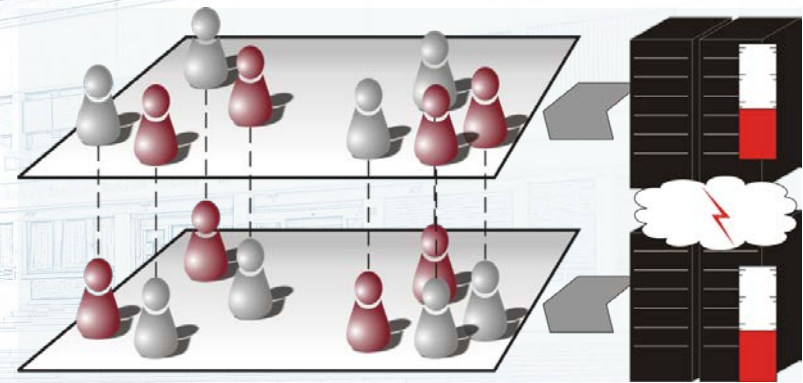
- **Zoning**

- Spatial partitioning
- Geographical sub-zones



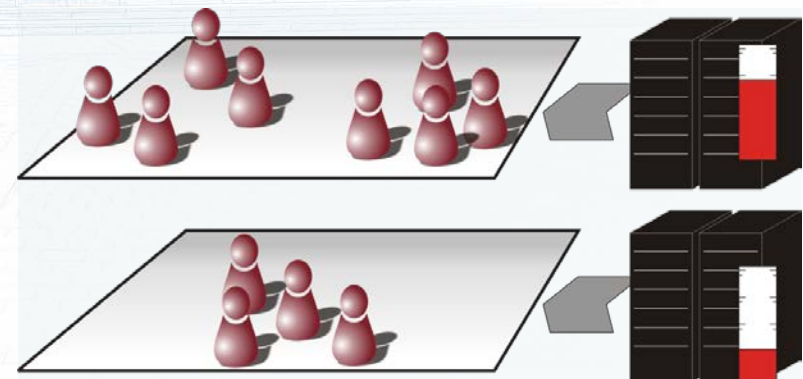
- **Replication**

- Entity distribution
- Synchronised states

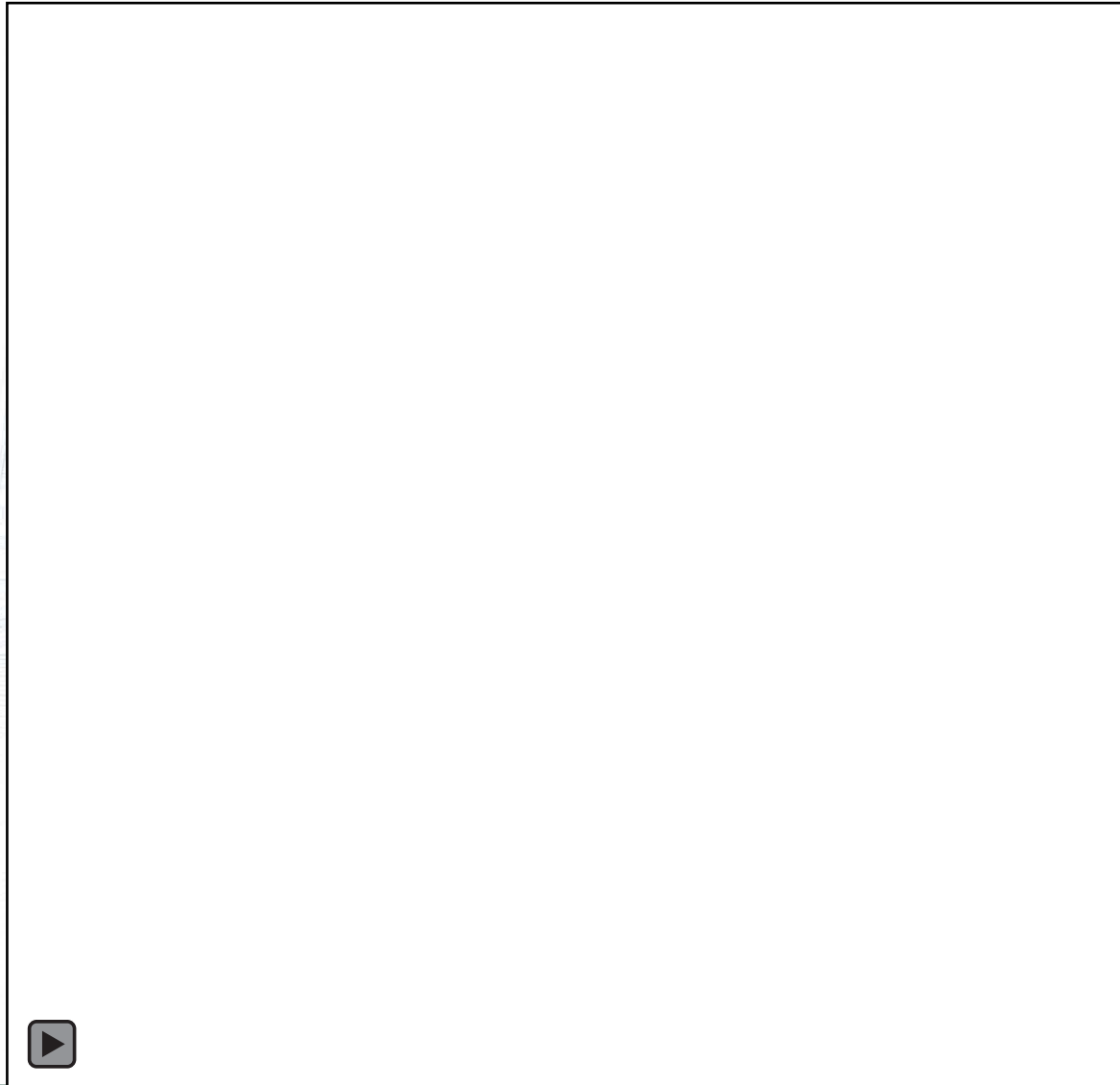


- **Instancing**

- Multiple instances with independent states



# FPS Game Demonstrator

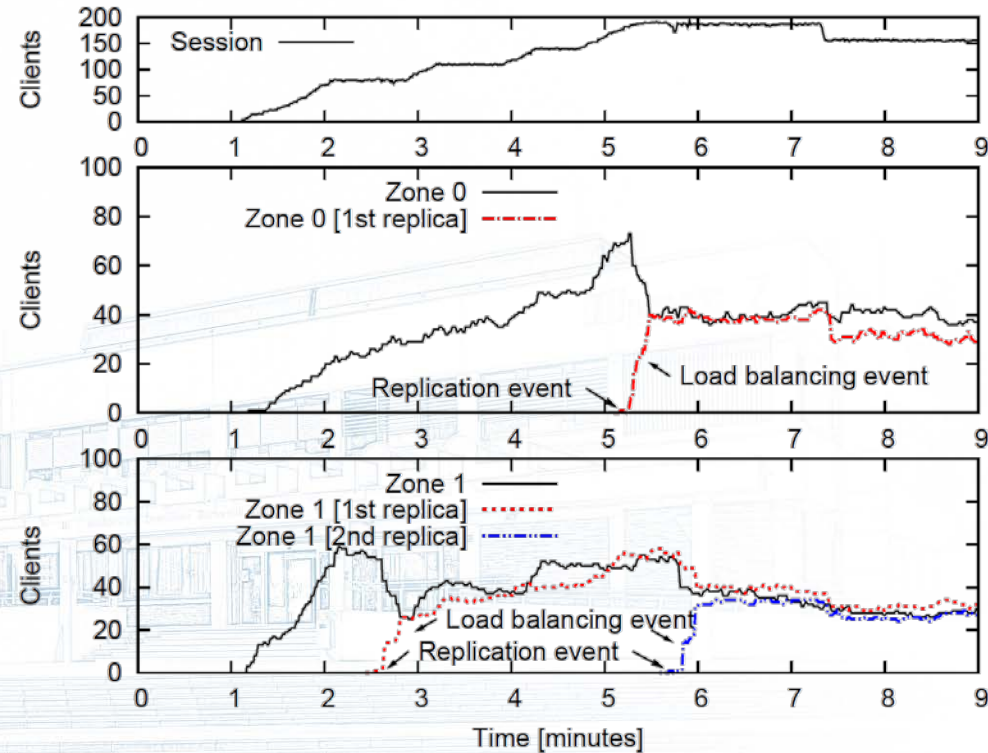
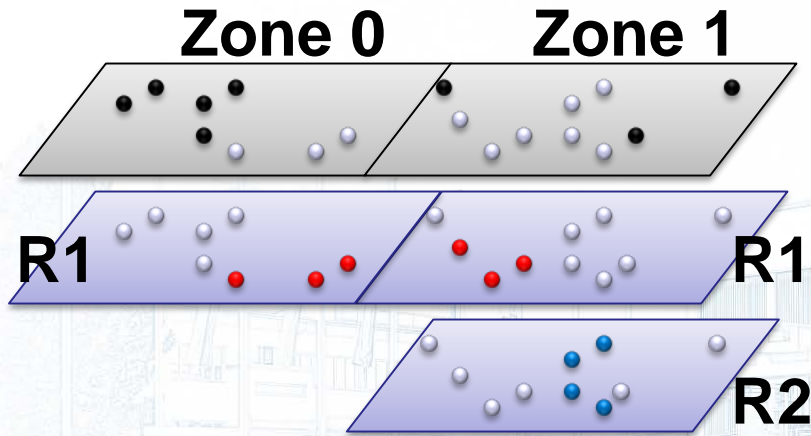


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# MMO Game Interaction-based Scaling

- several bot injection waves



Metric	Player density and interaction-based	Player threshold-based	
		40 clients/server	50 clients/server
QoS violations	0.66%	0.86%	8.69%
Resource utilisation	83.3%	100%	83.3%

# MMOOG Software Stack

Service Level Agreements

QoS fault tolerance

Resource provisioning

**Load modelling**

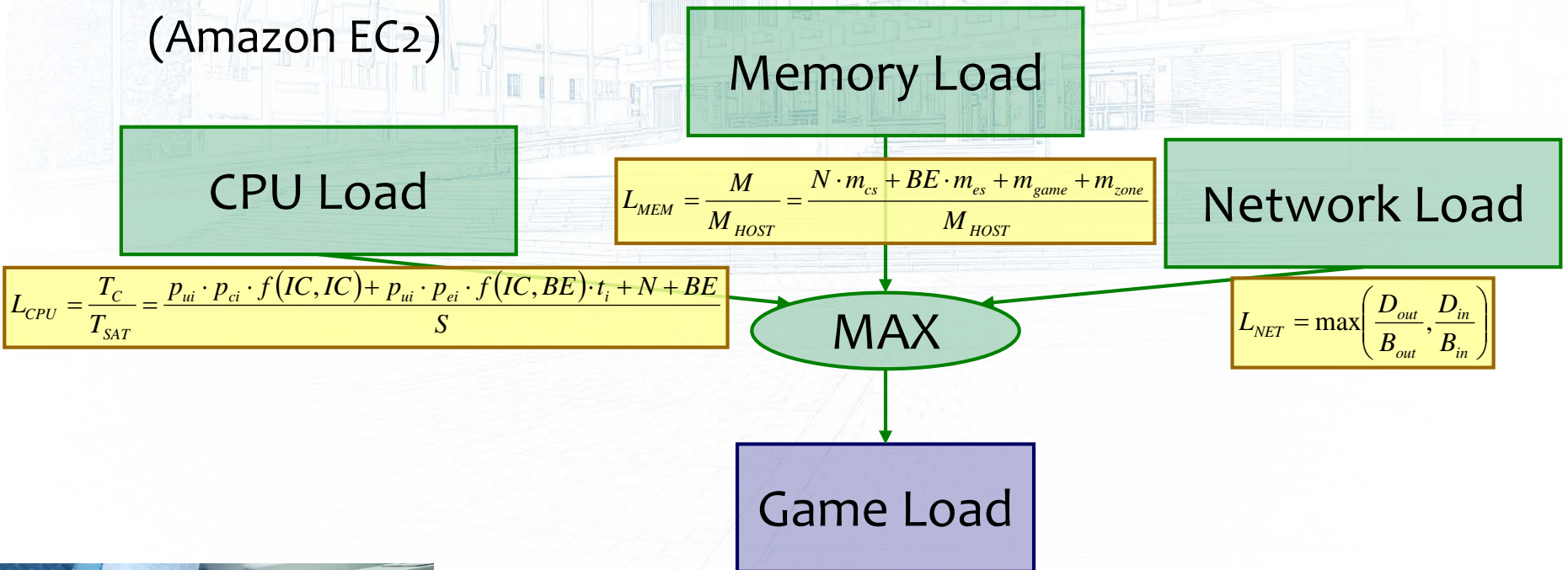
Parallelisation



# Load Modelling

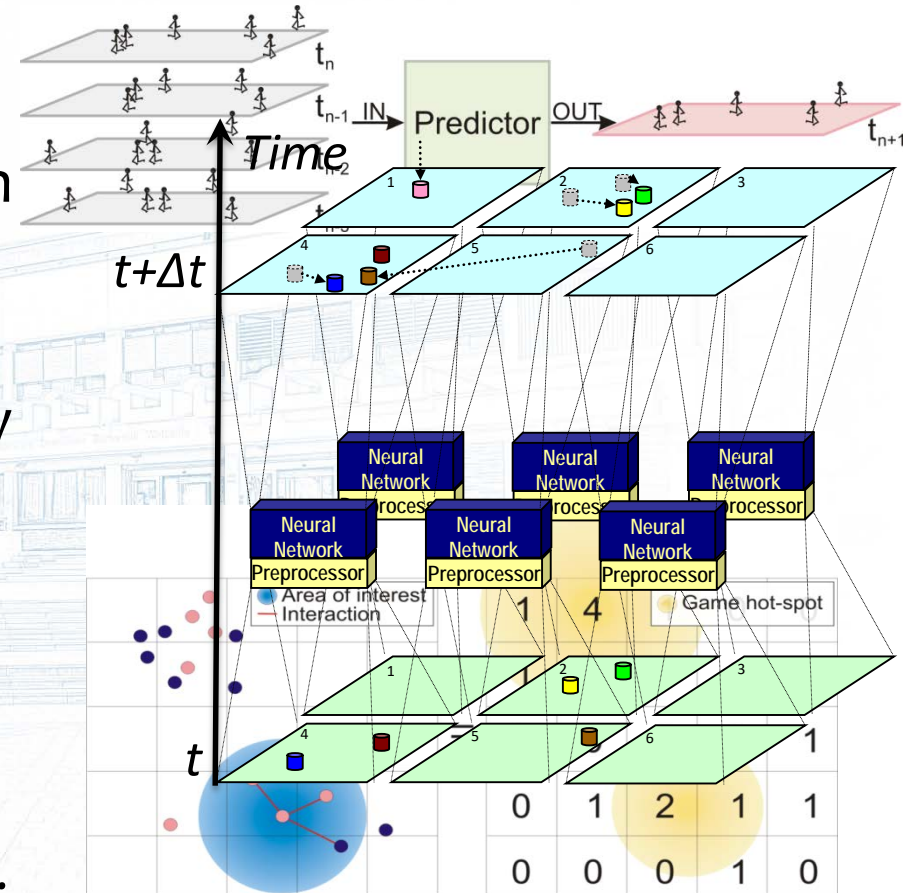
- Three characteristics
  - Entity distribution (position)
  - In-game player interaction (complexity)
  - Resource benchmarks (Amazon EC2)

$$f(e_1, e_2) = \begin{cases} e_1 + e_2 & O(n) \\ e_1 \cdot \log n & O(n \cdot \log n) \\ e_1 \cdot e_2 & O(n^2) \\ e_1^2 \cdot \log e_2 & O(n^2 \cdot \log n) \\ e_1^2 \cdot e_2 & O(n^3) \end{cases}$$



# Entity Distribution Prediction

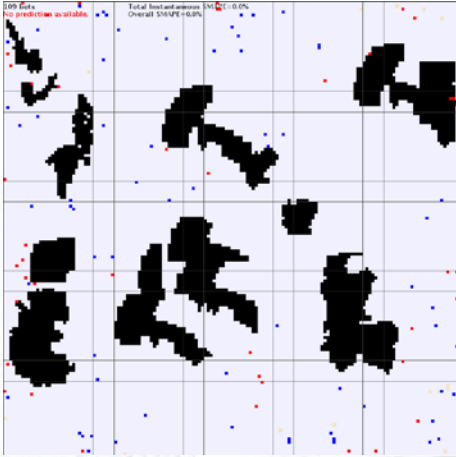
- Split game world into subareas
- Monitor number of entities in each subarea
- Use history to predict future entity distribution
- Single ML-based method that covers multiple player behavioural models
  - Achiever, explorer, socialiser, killer, ...
  - Improve on time series-based methods



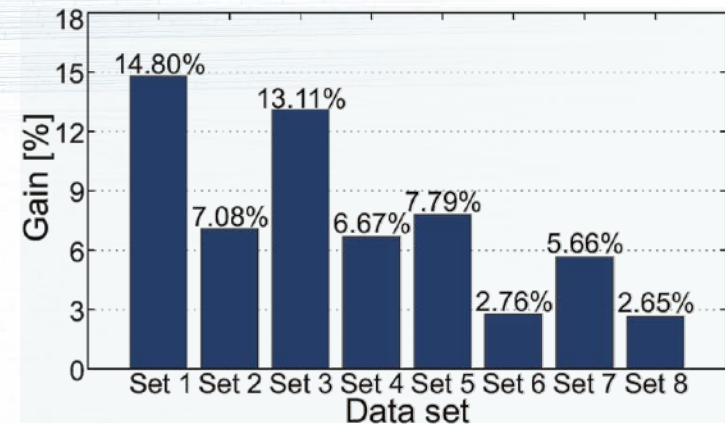
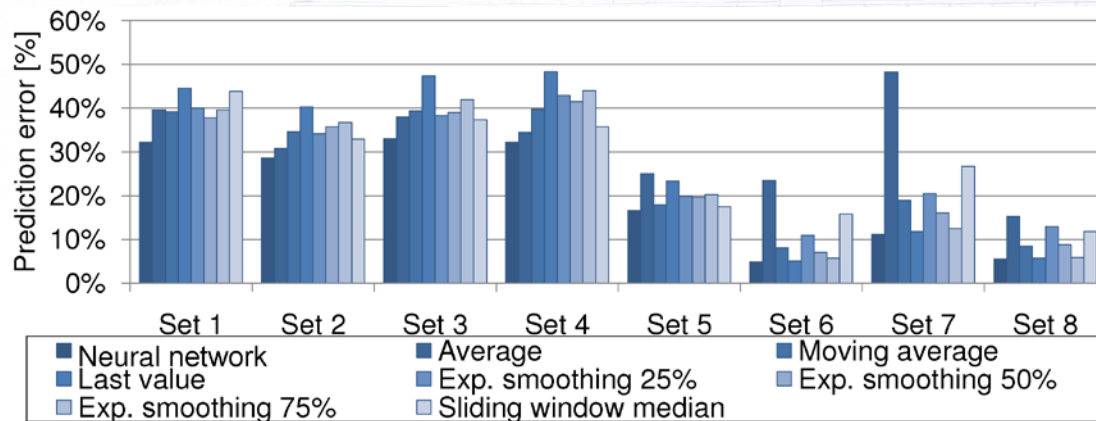


# Entity Prediction Results

- Game simulator with different player behavioural patterns



Data set	Player behaviour [%]				Peak hours	Peak load	Overall dynamics	Instantaneous dynamics
	Achiever	Explorer	Socialiser	Killer				
Set 1	80%	10%	0%	10%	No	+++++	+++++	+++++
Set 2	60%	10%	0%	20%	No	+ + + + +	+ + + + +	+ + + + +
Set 3	70%	20%	0%	10%	No	+ + + + +	+ + + + +	+ + + + +
Set 4	70%	30%	0%	0%	No	+ + + + +	+ + + + +	+ + + + +
Set 5	30%	40%	30%	0%	Yes	+ + + + +	+ + + + +	+ + + + +
Set 6	10%	80%	10%	0%	Yes	+ + + + +	+ + + + +	+ + + + +
Set 7	20%	40%	40%	0%	Yes	+ + + + +	+ + + + +	+ + + + +
Set 8	20%	80%	0%	0%	Yes	+ + + + +	+ + + + +	+ + + + +



# MMOOG Software Stack

Service Level Agreements

QoS fault tolerance

**Resource provisioning**

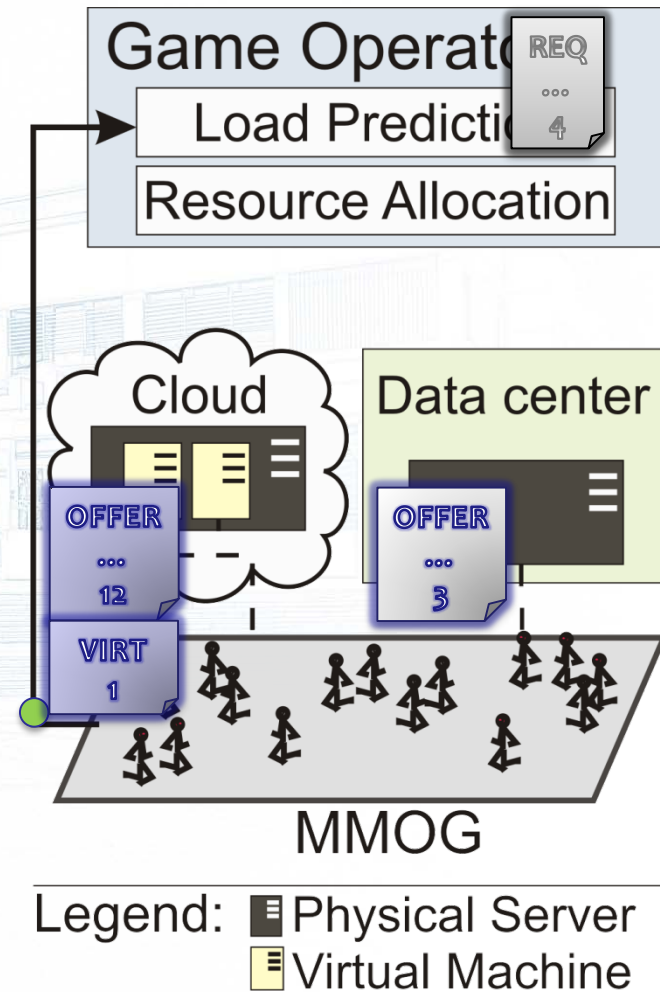
Load modelling

Parallelisation



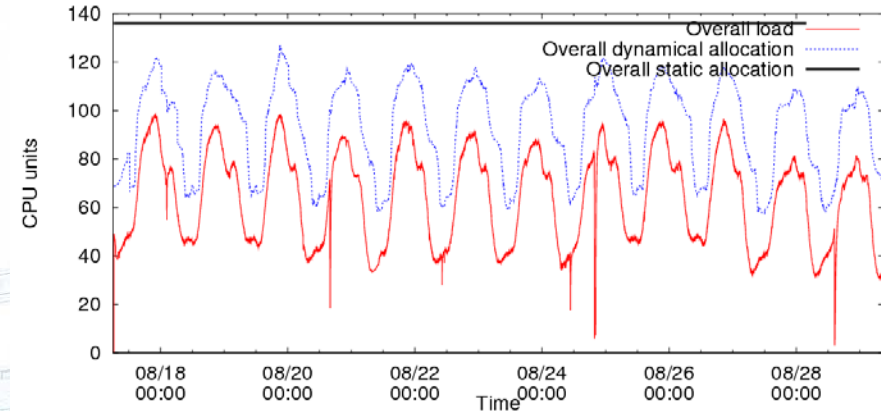
# Cloud Resource Provisioning

- **Game operators** generate resource requests based on predicted load
- **Cloud providers** lease virtualized resources based on time, space, price policies
- **Resource allocation** performed through a simple matchmaking consensus algorithm
  - Locality, instance type, size, duration, price



# RuneScape Resource Provisioning

- World's largest free MMORPG
  - 18 million active players per month (15 free + 3 members)
  - Over 200 million registered accounts since 2001
- 6 month long monitoring data
  - 17 data centres, 150 servers
  - 7 countries, 4 continents
  - > 130 game worlds
  - Number of player per server group at two minute interval
  - 40 million samples per simulation



Average load	Estimated yearly MMOG hosting costs [\$]					
	Amazon EC2		FlexiScale		NewServers	
	Dynamic	Static	Dynamic	Static	Dynamic	Static
0%	0	101,266	0	189,426	0	202,531
20%	23,326	101,266	40,920	189,426	38,468	202,531
50%	57,345	101,266	100,404	189,426	97,495	202,531
60%	57,830	101,266	101,829	189,426	98,179	202,531
70%	66,299	101,266	116,458	189,426	114,775	202,531
80%	75,709	101,266	133,111	189,426	129,119	202,531
90%	84,007	101,266	147,055	189,426	142,578	202,531
95%	88,199	101,266	155,039	189,426	149,793	202,531

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## Revisited

- Edge resource provisioning for latency hiding
- Serverless games
- Real-time three dimensional rendering
- Energy efficiency on mobile devices
- Quality of experience
- Challenge of raising public research funding



<http://itec.aau.at/>

**THANK YOU**

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