# Reducing randomness: the advent of self driving cars

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THUR DEPARTMENT

Erik van Doorn Symposium on Stochastic Processes, 26<sup>th</sup> September 2014, University of Twente, Enschede

Challenge the future 1



# Your speaker

1982-1986	MSc, Qeueing models at intersections, UT
1986-1990	PhD Queueing models for slotted transmission systems, UT
1991	Modelling traffic at roundabouts, Rijkswaterstaat
1992-2009	Modelling intelligent transport systems, TNO
2003-2009	Part-time professor Driver support system UT
2009	Professor Transport Modelling, TU Delft

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#### Analysis of a Queuing Model for Slotted Ring Networks

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Abstract. We study a multi-server multi-queue system which is intended to model a local area network with slotted ring protocol. Two special cases of the model are analysed and the results are used to motivate an approach to approximate mean queue lengths in the general model.

Keywords. Multi-server multi-queue system, slotted ring network, local area network, queue length, approximations.



Bart van Arem recived the M.S. and Ph.D. degrees in Applied Mathematics in 1986 and 1990 respectively, from the University of Twente, Enschede, The Netherlands. From 1986 until 1990 he was with the University of Twente, doing his Ph.D. research on queuing models for slotted transmission systems. His research interests include queuing theory, performance evaluation of computer and communication systems and traffic theory.

Firk A. van Doorn received his M.S. degree in Mathematics from Eindhoven University of Technology in 1974 and his Ph.D. degree in Technical Sciences from the University of Twente, Enschede, in 1979. From 1980 to 1982 the Was with the Neher Laboratories of the Netherlands Postal and Telecomnumications Services in Leidschendam, and from 1982 to 1985 with the Centre for Mathematics and Computer Science and the Index Services in Leidschendam, and from 1982 to 1985 with the Part Science and Science

Centre for Mathematics and Compater Science in Amsterdam. In 1985 of the University of Twente again as an associate professor in applied probability. His research interests range from theoretical issues in analysis and probability theory to application-oriented topies in the areas of queuing and teletrafic theory.

#### North-Holland

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#### 1. Introduction

The following queuing system generalizes earlier proposals for modelling a local area network with slotted ring protocol. Consider c equidistant slots (servers) moving with constant speed along a closed track. The time needed by a slot to make a complete round trip along the track is denoted by  $\tau$ . At fixed positions along the track are *n* stations (queues) numbered 1, 2, ..., n, at which packets (customers) arrive in batches. The arrival of batches at station i is governed by a Poisson process with intensity  $\lambda_i$ . The sizes of the batches arriving at station i constitute a sequence of mutually independent and identically distributed random variables with finite means and variances; the batch sizes are also independent of the batch arrival processes. We let A, denote the generic number of packets that arrive at station i in an interval of time of length  $\tau/c$  (the time between the passages of two consecutive slots at a particular station). Defining  $\mathscr{B}_i(z) = E(z^{B_i}), |z| \leq 1$ , where  $B_i$  denotes the size of a generic batch arriving at station *i*, and  $\mathscr{A}_i(z) \equiv E(z^{A_i}), |z| \leq 1$ , it is easy to see that

#### $\mathscr{A}_{i}(z) = \exp(-(\lambda_{i}\tau/c)(1-\mathscr{B}_{i}(z))).$ (1.1)

By  $\alpha_i$  and  $\sigma_i^2$  we denote the mean and variance, respectively, of the number of packets that arrive at station *i* in an interval of time of length  $\tau/c$ . Clearly,

$\alpha_i = \infty$	$l'_{i}(1) =$	$(\lambda_i \tau/c) \mathscr{B}'_i(1)$	(1.
$\alpha_i = \infty$	$r_{i}(1) =$	$(\Lambda_i \tau/c) \mathfrak{s}_i(1)$	(

$$\sigma_i^2 = \mathscr{A}_i''(1) + \alpha_i - \alpha_i^2$$

and

$$= (\lambda_i \tau/c) (\mathscr{B}_i''(1) + \mathscr{B}_i'(1)), \qquad (1.3)$$

and both  $\alpha_t$  and  $\sigma_t^2$  are finite by our assumption that the mean and variance of a batch size are finite.

Each station has infinite capacity for storing packets. The packets are released by the stations according to the following mechanism. Any station that has at least one packet in store waits





# Reducing randomness...

Road traffic flow strongly heterogeneous and stochastic

First moment of delay depends on second moment of inter arrival times

Randomness of driver/vehicle behaviour in terms of anticipation, speed, reaction time, acceleration

Can self driving vehicles reduce randomness and improve traffic flow efficiency?







# What is automated driving?

#### Partial automation



Available, Mercedes S class Limited scope



#### High automation



Massive worldwide R&D

Decades away unless on dedicated infrastructure or driving very slowly

#### Full automation



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#### Automated Vehicle System, Graham Market Introduction (SAE Levels), Median, IQR



# Potential impacts





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# The congestion assistant

- Detects downstream congestion
- Visual and auditive warning starting at 5 km before congestion
- Active gas pedal at 1,5 km to smoothly slow down
- Takes over longitudinal driving task during congestion







# Impacts on driving behaviour



Motorway scenario with congestion Impacts on driving behaviour Acceptance



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### Effects on mean speed



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### Effects on time headway



May 31, 2006



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Applications of

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### **ITS Modeller**



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### Longitudinaal bestuurdersmodel

$$a_{ref_v} = r \cdot \left( v_{ref} - v \right)$$

$$a_{ref\_d} = c_d \cdot (d(t-t_r) - d_{ref}) + c_{v\_p} \cdot v_{rel\_p} (t-t_r) + c_{v\_pp} \cdot v_{rel\_pp} (t-t_r)$$

$$d_{ref} = c_1 + c_2 \cdot v + c_3 \cdot v^2$$

13 November 2009



#### Study area: merging area A12 motorway, Woerden, the Netherlands







#### Calibratie





### Model file assistent

Actief gaspedaal:

$$a_{ac} = \frac{v_j^2 - v^2}{2 \cdot x}$$

Stop & Go

$$d_{st} = d_0 + t_{st} \cdot v$$

$$a_{st\_v} = r_{st} \cdot (v_{int} - v)$$

$$a_{st\_d} = k_a \cdot (k_d \cdot (d - d_{st}) + k_v \cdot v_{rel\_p})$$

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#### Resultaten

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### Resultaten-2

	Travel time (min)	Delay (min)	Delay reduction
Free flow (110 km/h)	3.4	-	-
Reference	5.7	2.3	-
500 m / 0.8 s (10%)	5.0	1.6	30%
500 m / 0.8 s (50%)	4.3	0.9	60%



# Challenges

Sensing and control Localization and positioning Communication networks

Closing the circle

Human factors: Behavioral adaptation, Authority transitions Traffic management Transport system design Travel patterns

#### Multi-scale modelling



# Lessons from Erik

- Always careful, precise
- Straight feedback
- Committment
- Humor
- Heen en weer blocnote
- Right drink at the right time











