

Some additional features of the Geometric Brownian Motion car-following model

Jorge A. Laval

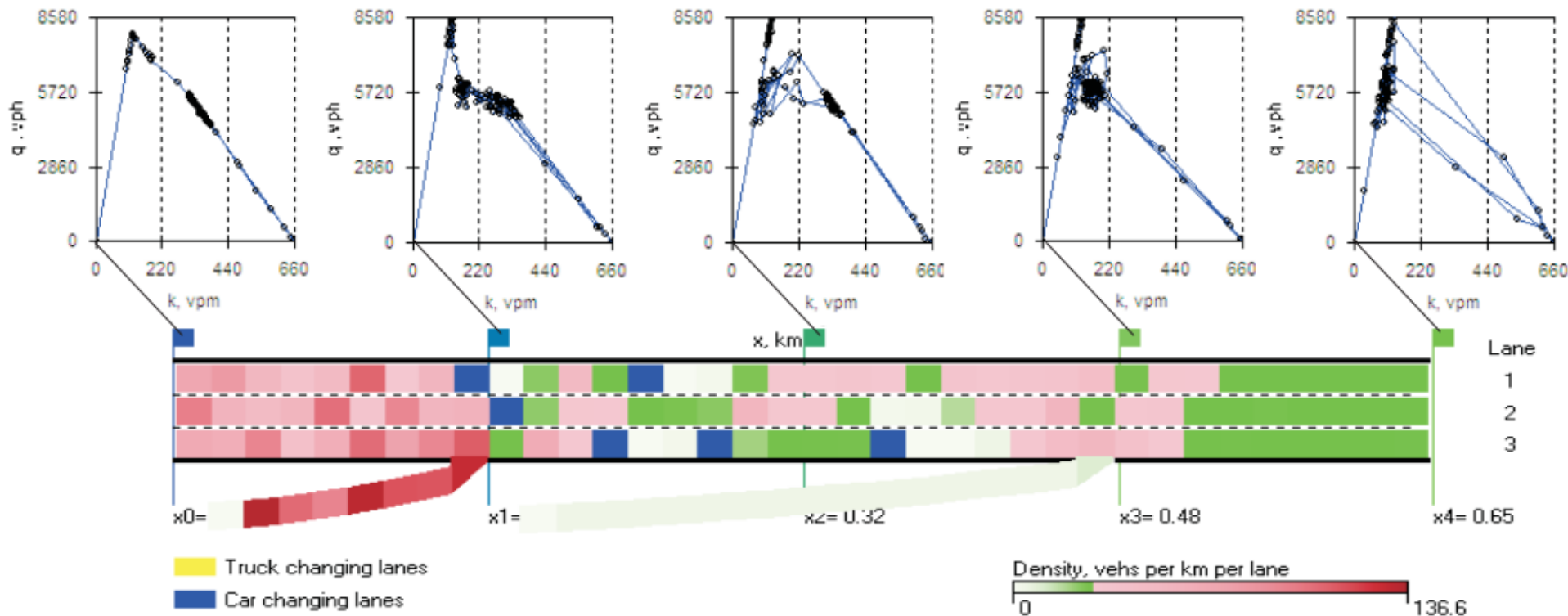
TU Delft, Dec 2016

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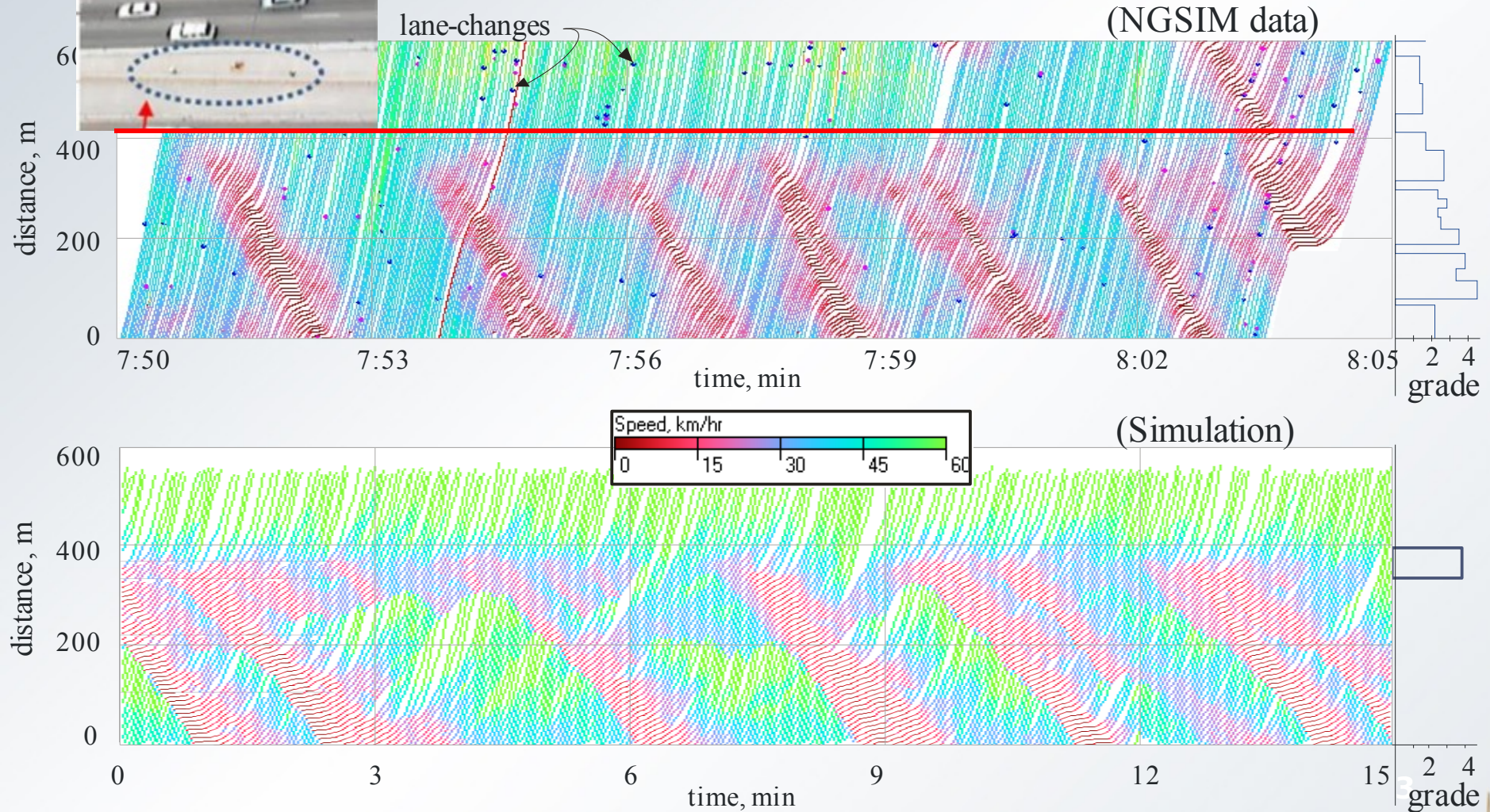


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Multilane instabilities - FD scatter



Section: NGSIM US-101

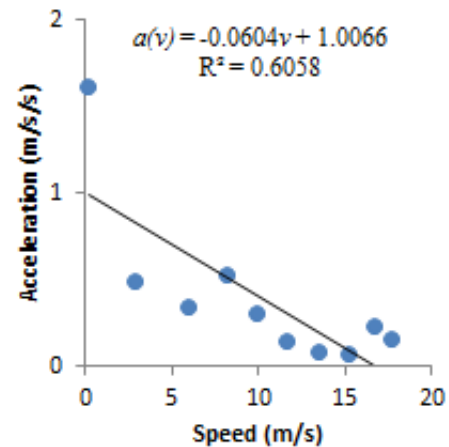
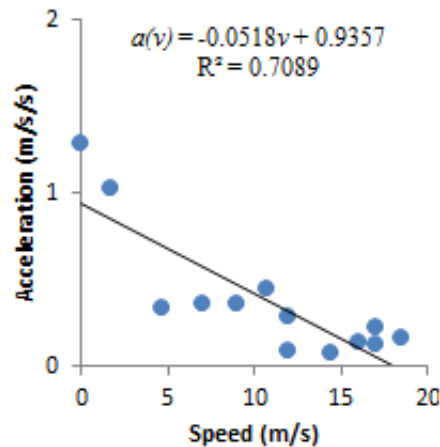
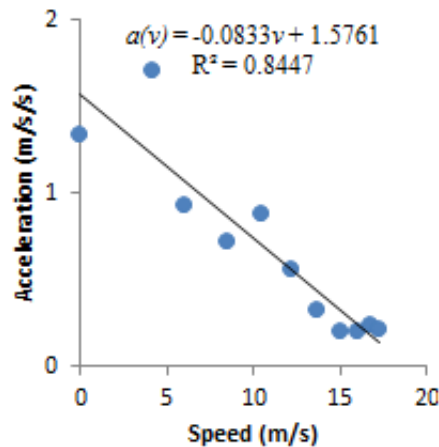
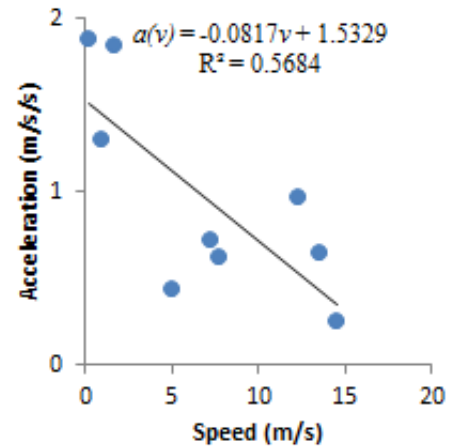
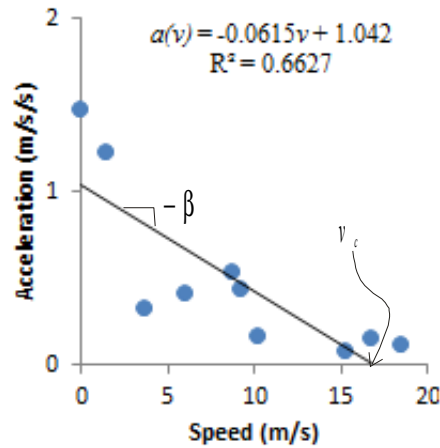
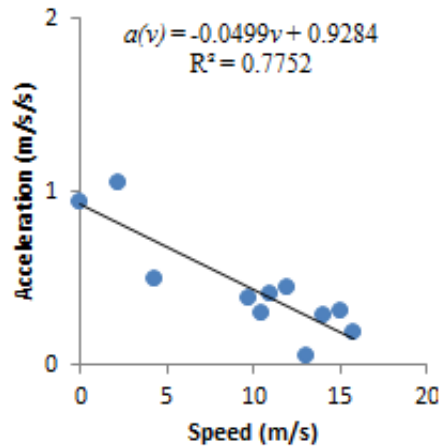
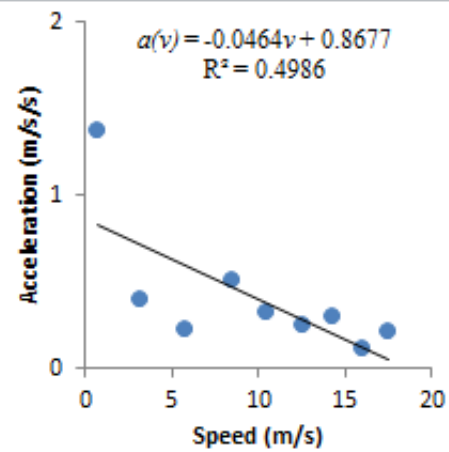
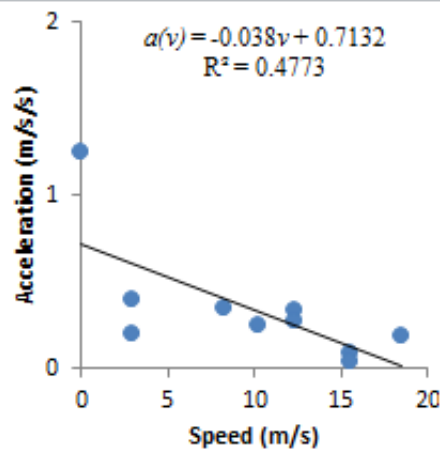
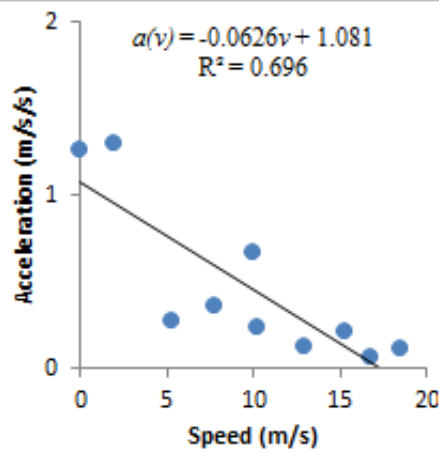


The hypothesis

- the random error in drivers acceleration processes may be responsible for most traffic instabilities:
 - Formation and propagation of oscillations
 - Oscillations growth
 - Hysteresis
- Laval, Toth, and Zhou (2015), A parsimonious model for the formation of oscillations in car-following models. *Transportation Research Part B* 70, 228-238.

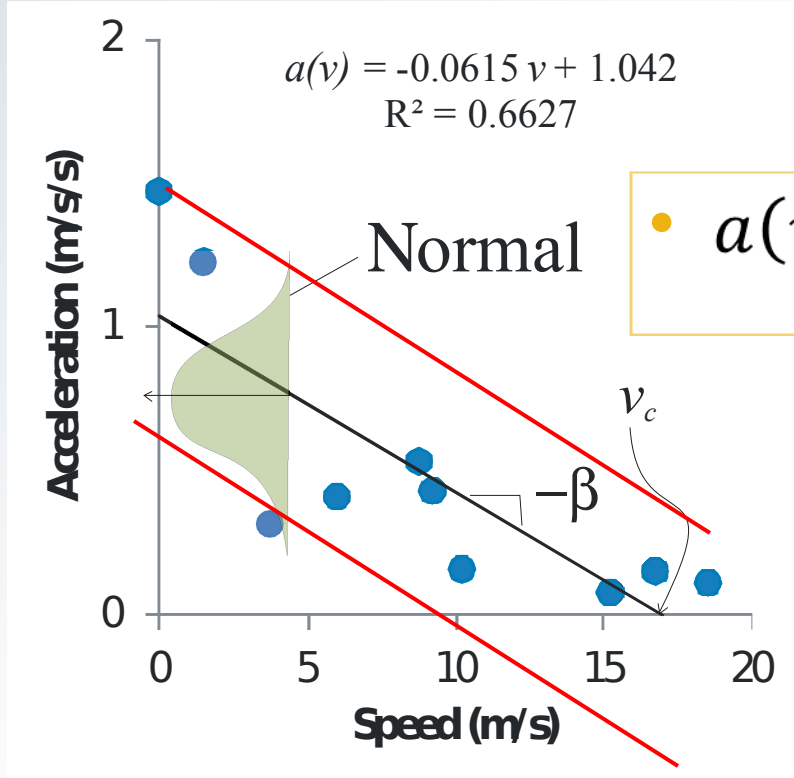
Scope

- Car-following only, no lane changes
- Single lane
- Homogeneous drivers, no trucks



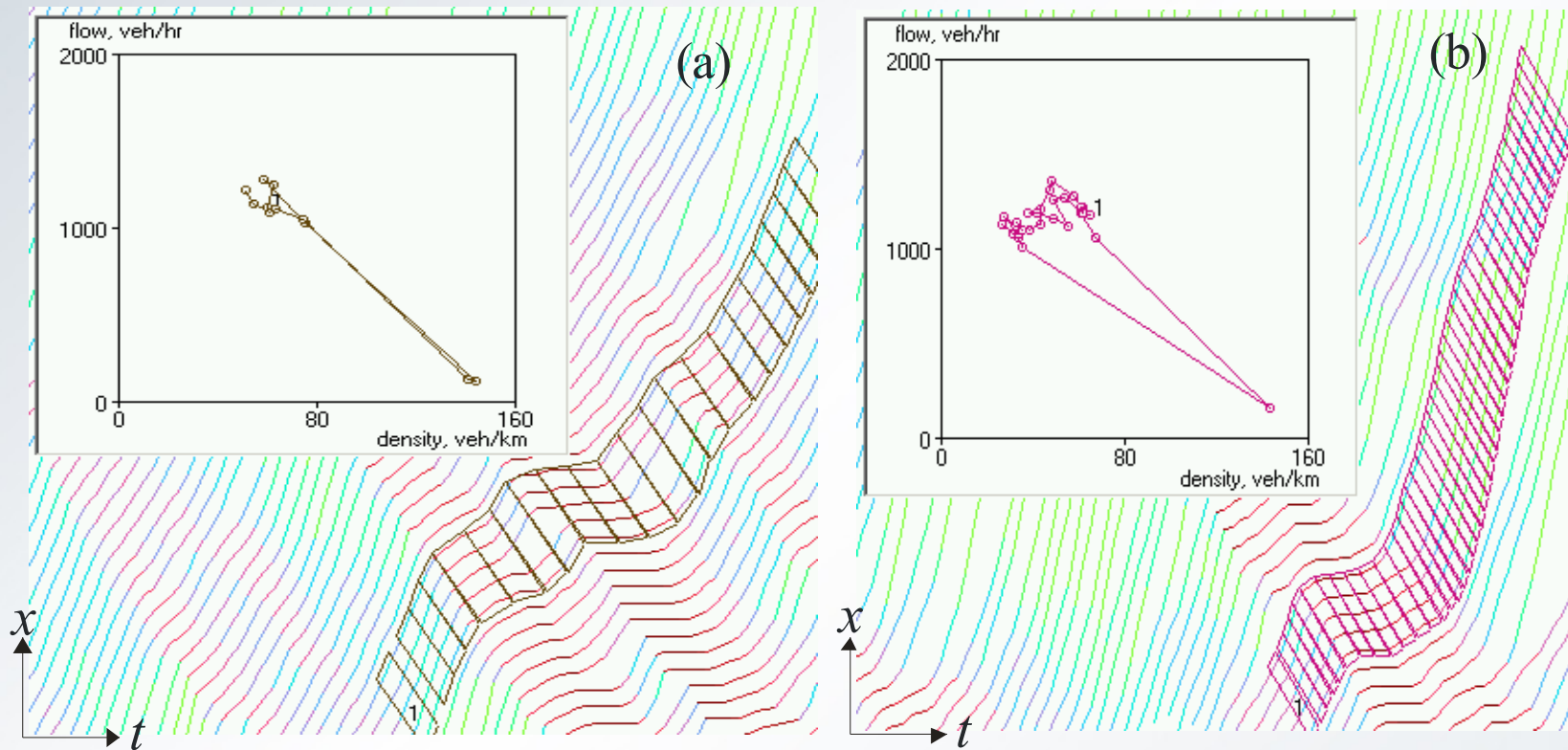
Stochastic desired accelerations

- desired acceleration a_E vehicle downstream does not constrain the motion



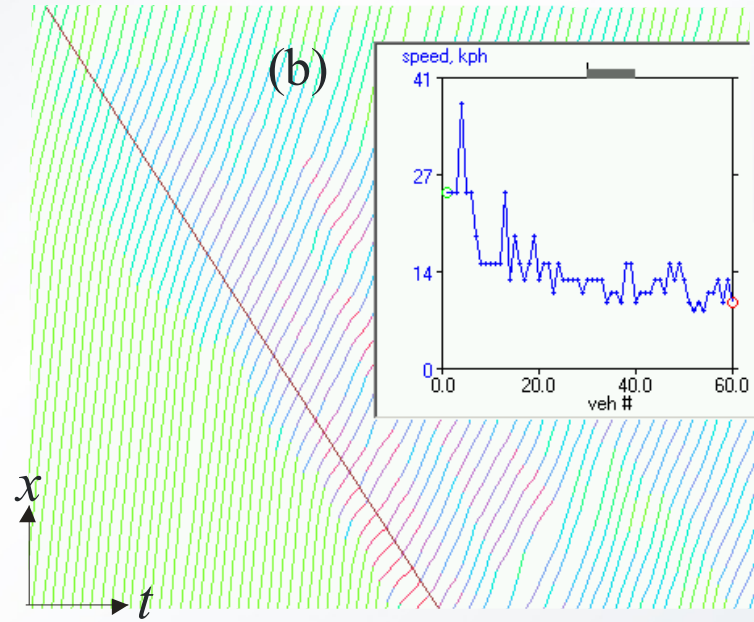
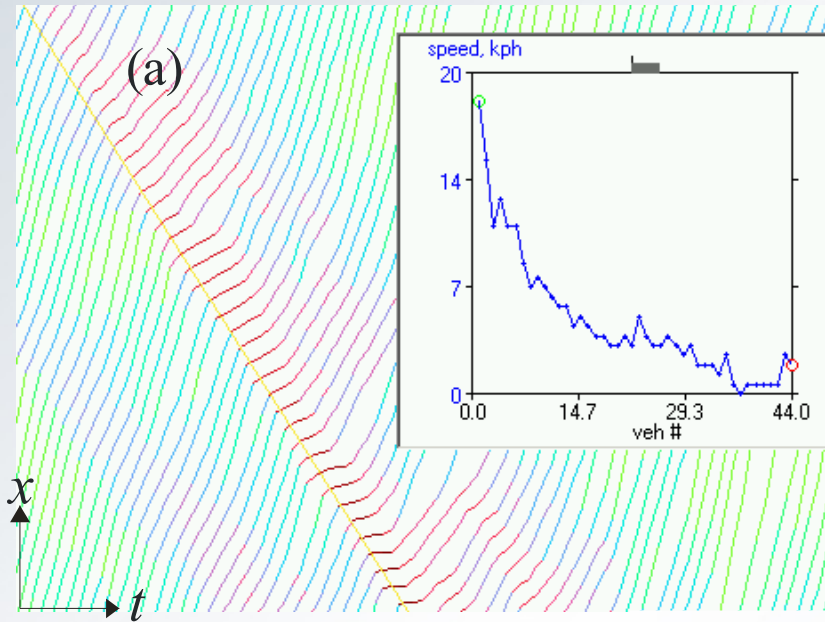
- $a(v) = (v_c - v)\beta + \text{white noise}$

Model captures hysteresis

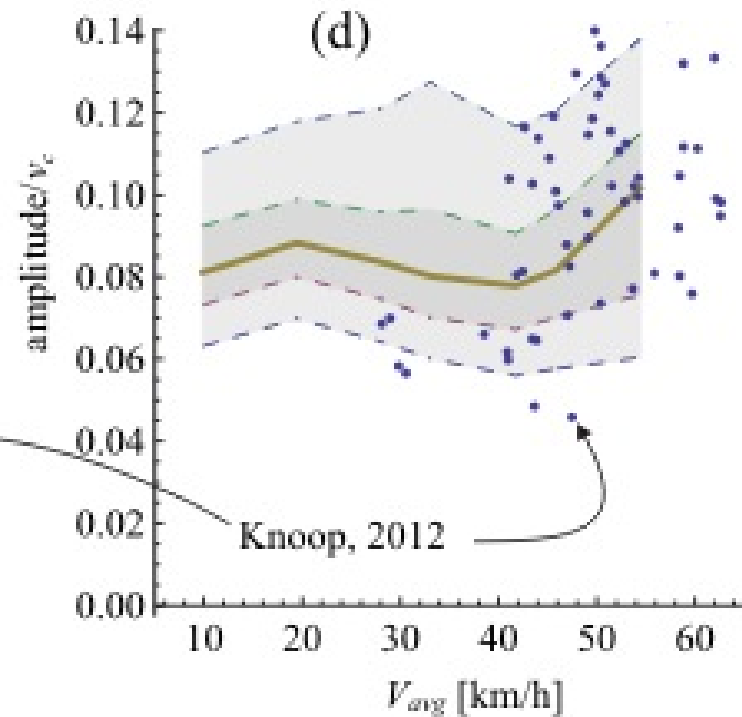
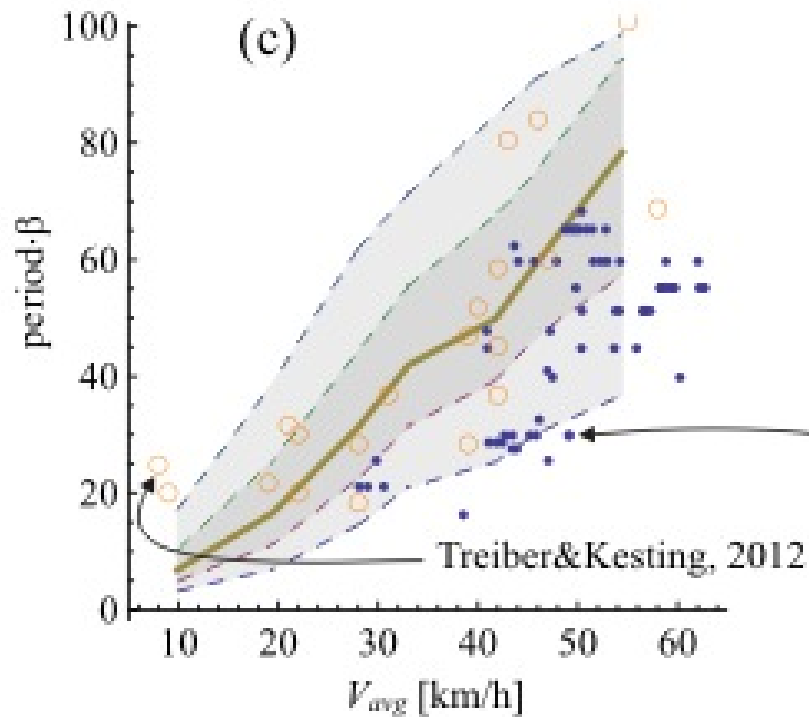


Trajectory Explorer (traffyclab.ce.gatech.edu)

Model captures oscillation growth

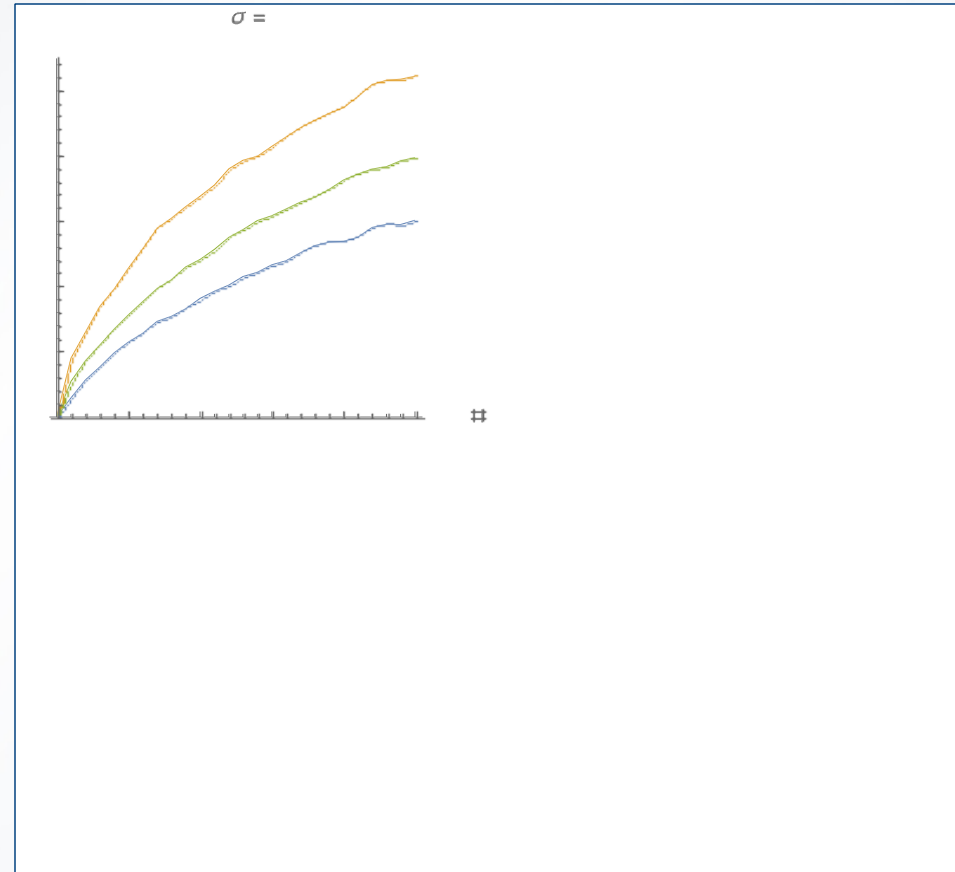
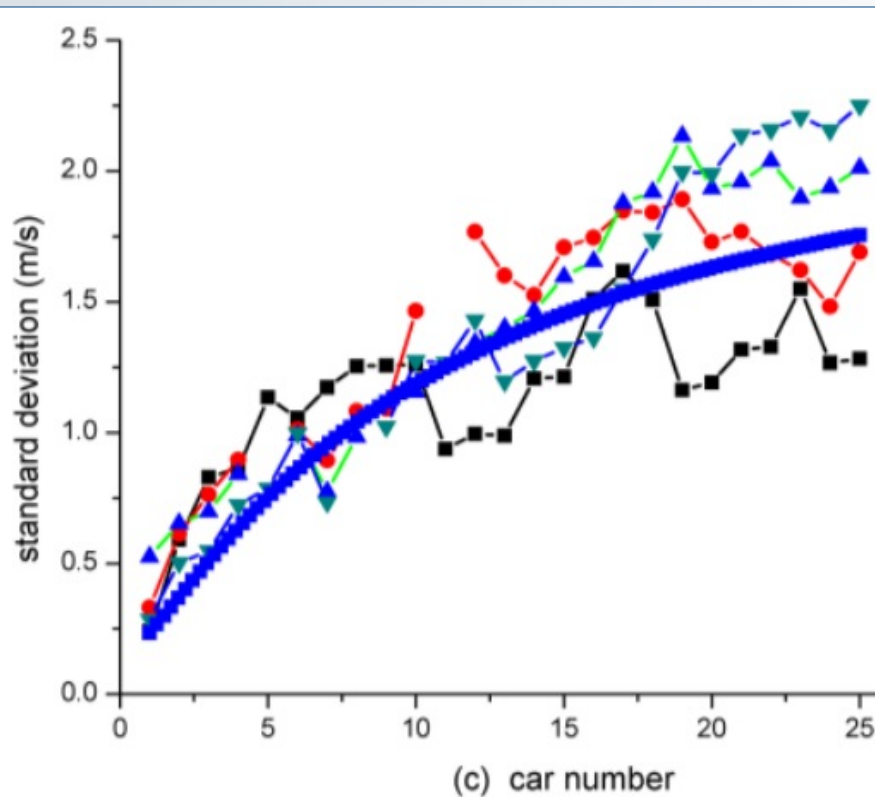


Oscillations period and amplitude

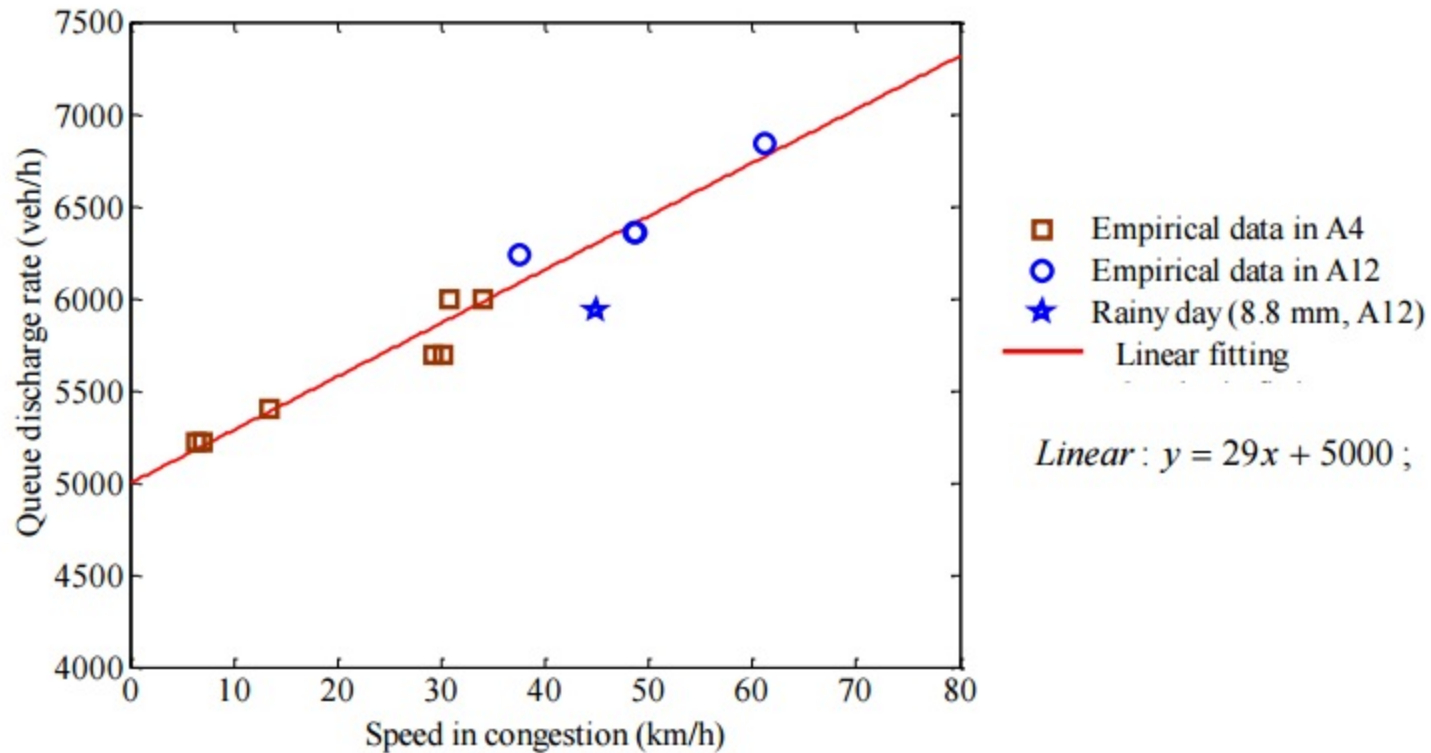


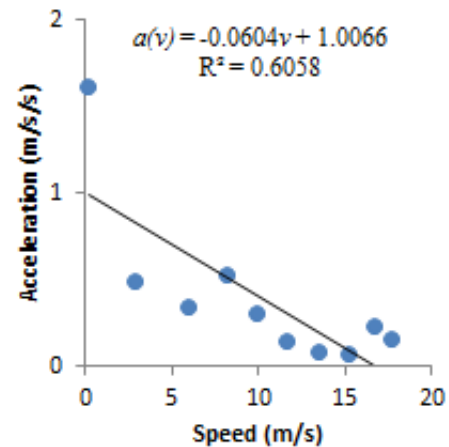
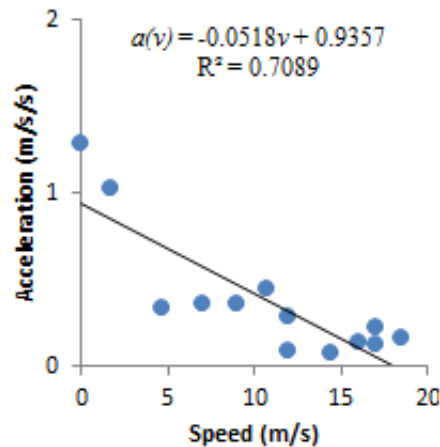
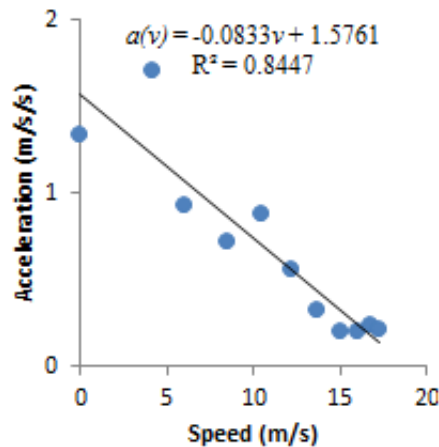
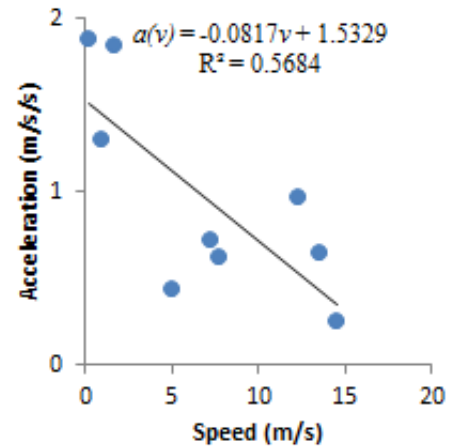
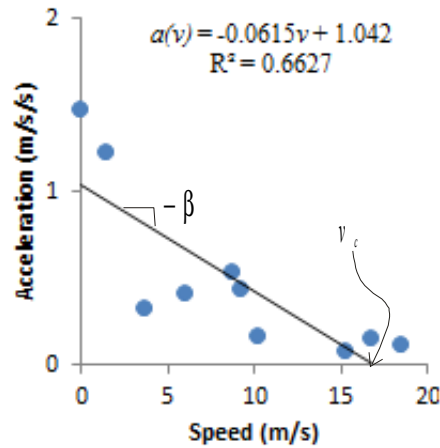
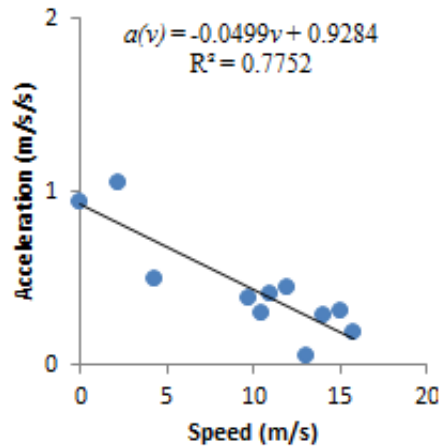
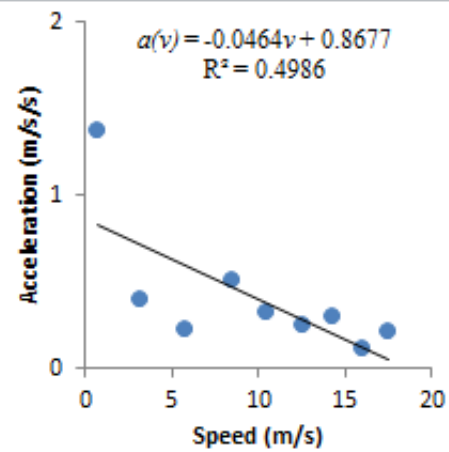
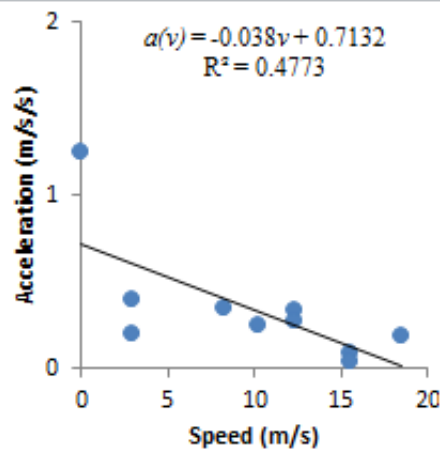
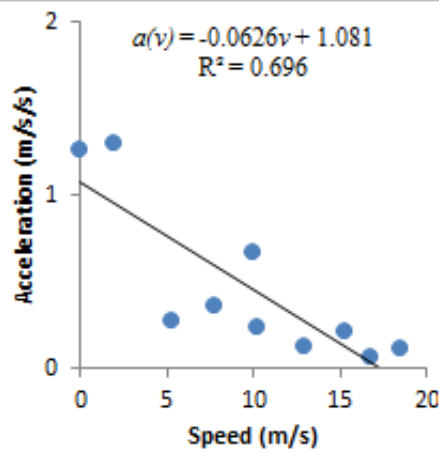
Model captures “concavity”

- Tian et al, Trans. Res. B (2015)
- Jian et al, PloS one (2014)



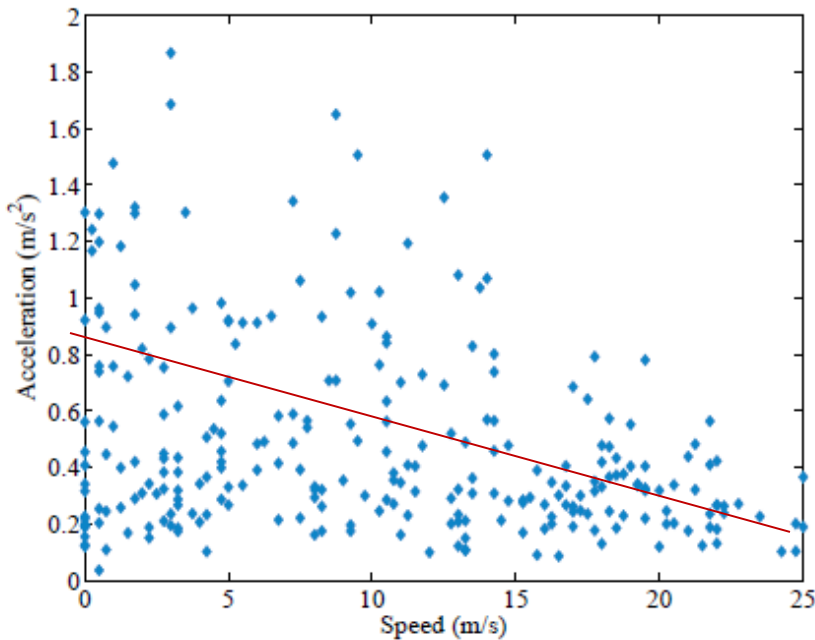
Does not capture capacity-BN speed relation



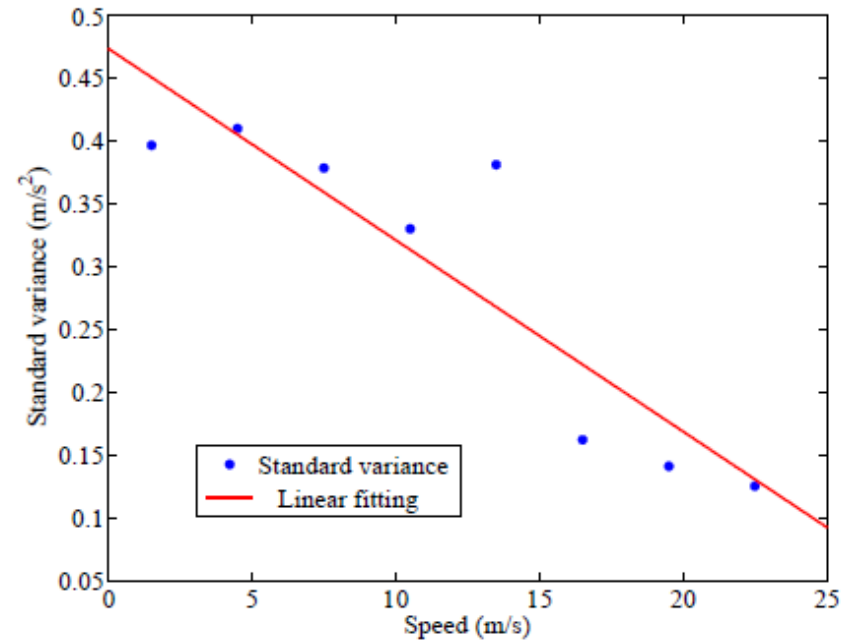


Brownian motion formulation

- desired acceleration a_E vehicle downstream does not constrain the motion

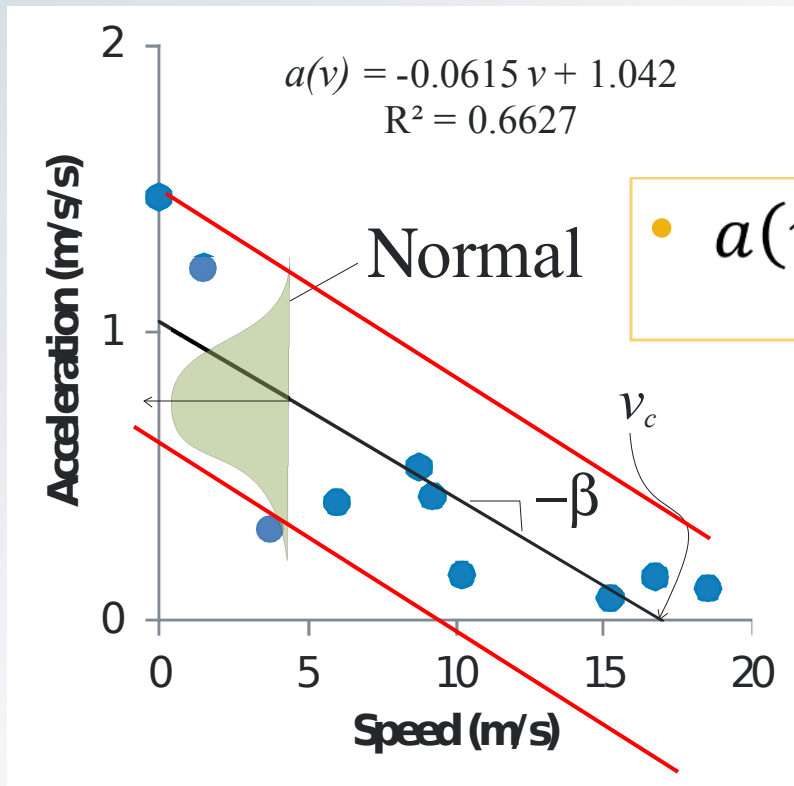


(a) Drivers' desired acceleration when traveling at different speed.



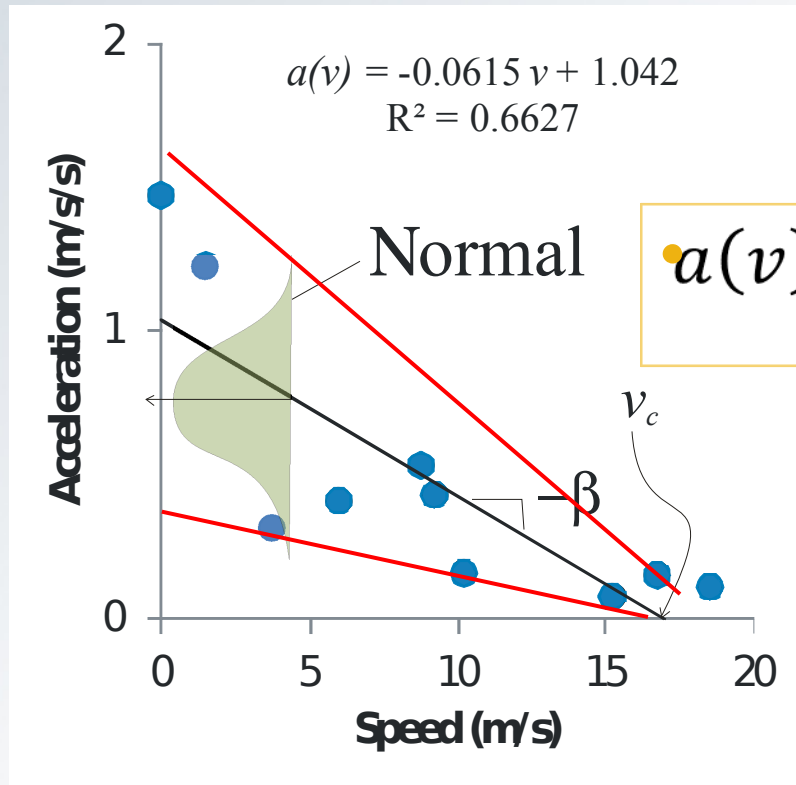
(b) Standard variance of drivers' desired accelerations at different vehicular speeds v .

Brownian motion (BM) formulation



- $a(v) = (v_c - v)\beta + \text{white noise}$

Geometric Brownian motion formulation



$$a(v) = (v_c - v)\beta + \text{white noise}(v)$$

The BM Stochastic ODE

$\xi(t)$ = position at time t

$v(t)$ = speed at time t

$W(t)$ = standard Brownian motion,

σ^2 = diffusion coefficient, units of $[\text{distance}]^2[\text{time}]^{-1}$

$$\begin{cases} d\xi(t) = v(t)dt, & \xi(0) = 0, \\ dv(t) = (v_c - v(t))\beta dt + \sigma dW(t), & v(0) = v_0, \end{cases}$$

Note: β can be eliminated by measuring time in units of $1/\beta$, i.e. redefining t as βt .

The GBM Stochastic ODE

$\xi(t)$ = position at time t

$v(t)$ = speed at time t

$W(t)$ = standard Brownian motion,

σ^2 = diffusion coefficient, units of $[\text{time}]^{-1}$

$$\begin{cases} d\xi(t) = v(t)dt, & \xi(0) = 0, \\ dv(t) = (v_c - v(t))(\beta dt + \sigma dW(t)), & v(0) = v_0, \end{cases}$$

Distribution of $v(t)$

- Normal for BM and LogNormal for GBM, with:
- Expected value, BM and GBM

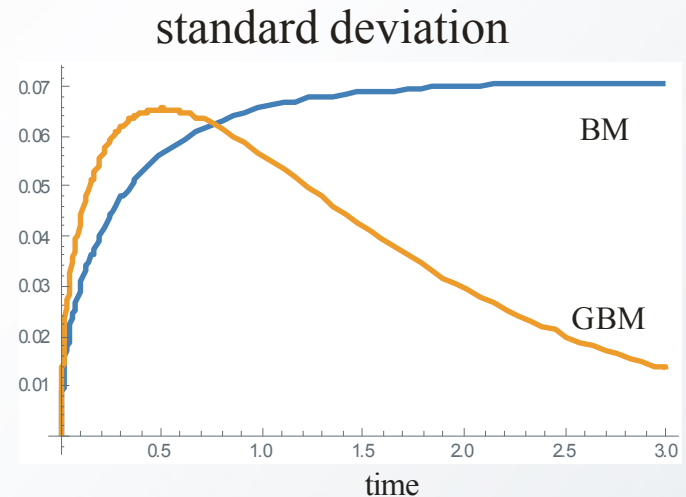
$$E[v(t)] = u + e^{-t} (u - v_0)$$

- Variance, BM

$$V[v(t)] = \sigma^2 (1 - e^{-2t}) / 2$$

- Variance, GBM

$$V[v(t)] = e^{-2t} (u - v_0)^2 \left(e^{\sigma^2 t} - 1 \right)$$



Distribution of $\xi(t)$

- Normal for BM and GBM, with:
- Expected value, BM and GBM

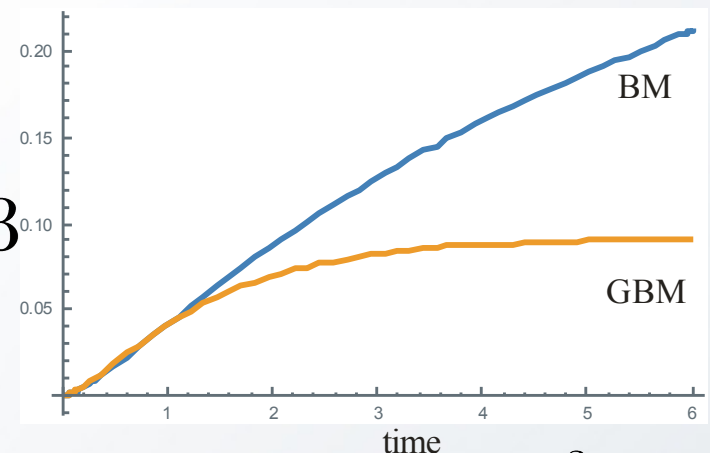
$$E[\xi(t)] = (t + e^{-t} - 1) u + v_0 (\sinh(t) - \cosh(t) + 1)$$

standard deviation

- Variance, BM

$$V[\xi(t)] = \frac{1}{2} \sigma^2 e^{-2t} (e^{2t} (2t - 3) + 3)$$

- Variance, GBM



$$V[\xi(t)] = e^{-2t} (u - v_0)^2 \left(\frac{\sigma^2 (e^t (2\sigma^2 + e^t - 4) + 3) + 2e^{\sigma^2 t} - 2}{\sigma^4 - 3\sigma^2 + 2} \right)$$

Plugin to Newell's car-following model

$$x_{i+1}(t) = \min \left\{ \underbrace{x_{i+1}(t - \tau) + \xi_{i+1}(\tau)}_{\text{free-flow}}, \underbrace{x_i(t - \tau) - \delta}_{\text{congestion}} \right\}$$

where:

τ = wave trip time between two cars

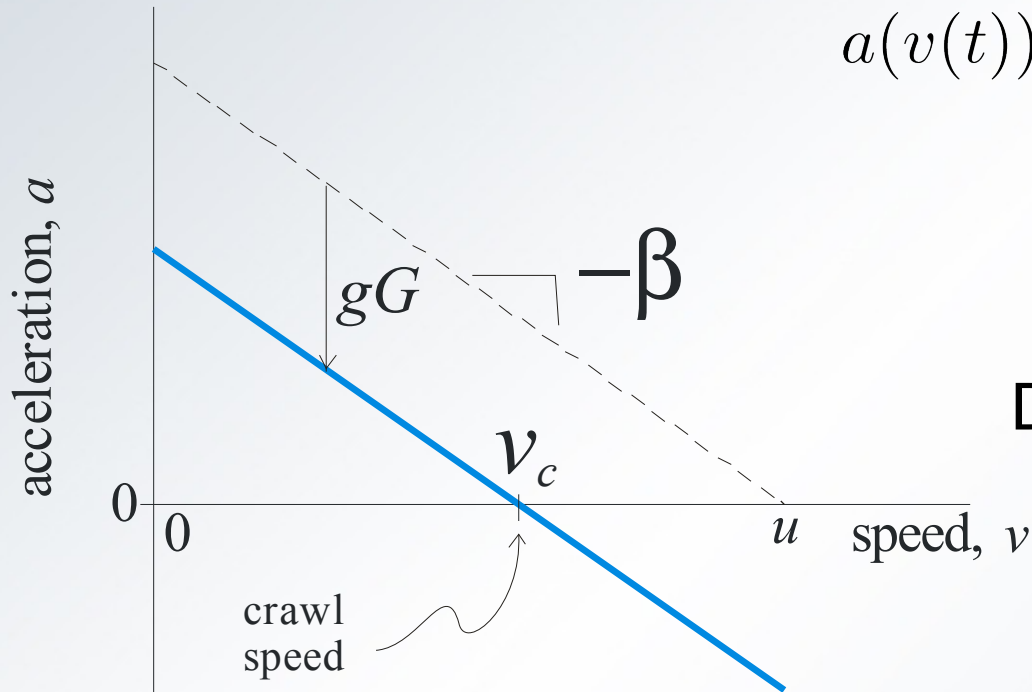
δ = jam spacing,

$x_{i+1}(t)$ = position of vehicle $i + 1$ at time t

$\xi_{i+1}(\tau)$ = vehicle displacement between $t - \tau$ and t

Effect of Grade

- On a 100G% upgrade



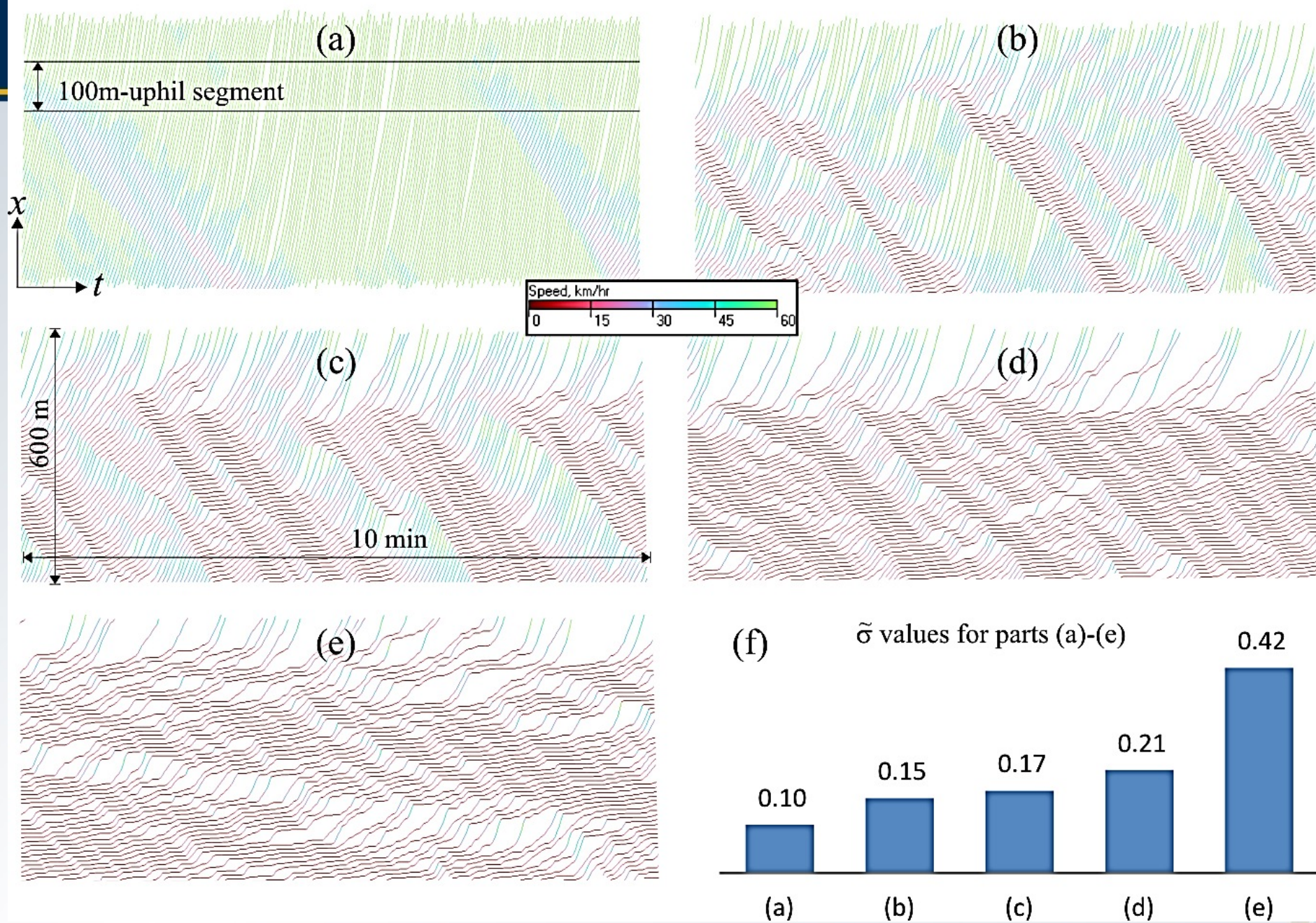
$$a(v(t)) = (u - v(t))\beta - gG$$

$$= \underbrace{(u - gG/\beta - v(t))\beta}_{v_c}$$

Dimensionless parameter

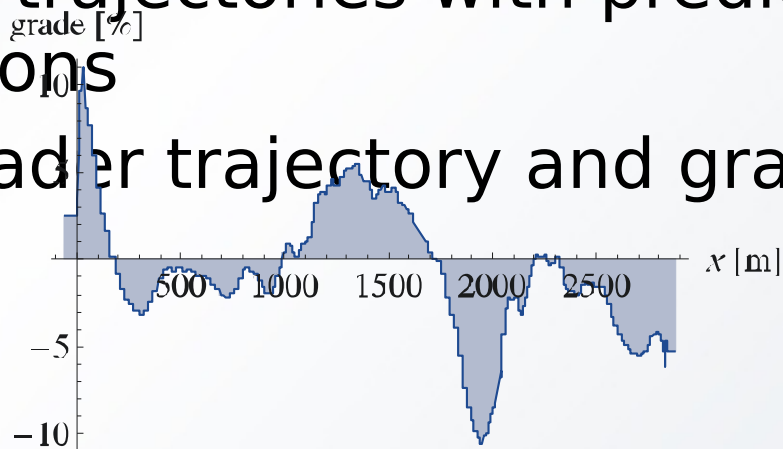
$$\tilde{\sigma}^2 = \frac{\sigma^2}{v_c^2 \beta} \quad (\text{BM})$$

$$\tilde{\sigma}^2 = \frac{\sigma^2}{\beta} \quad (\text{GBM})$$

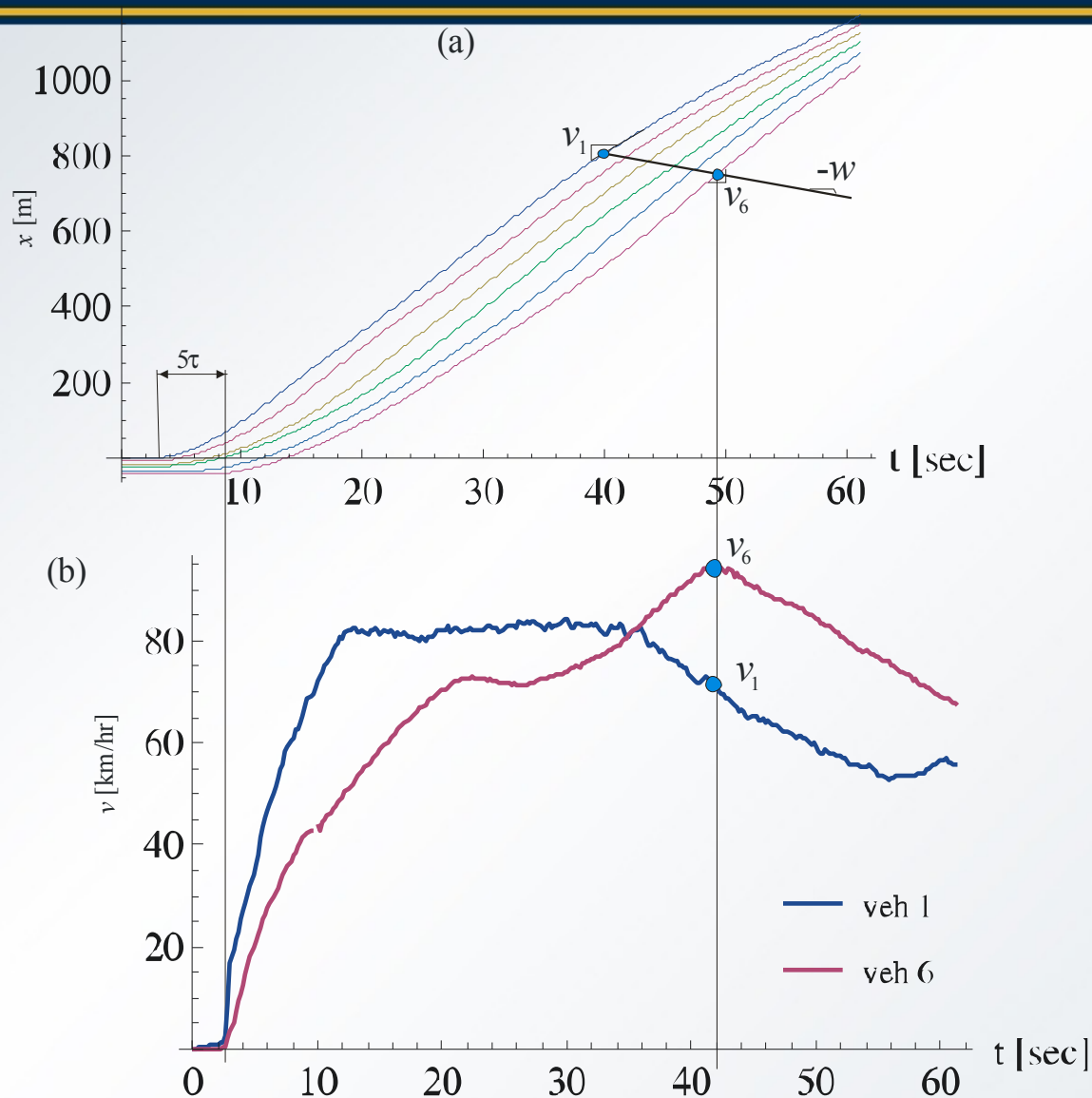


Car-following experiment

- 6-vehicle platoon, unobstructed leader
- 5Hz GPS devices and Android app in each vehicle
- two-lane urban streets around Georgia Tech campus
- Objective:
 - compare trajectories with predicted distributions
 - given: leader trajectory and grade $G=G(x)$



Trailing vehicle speed peak



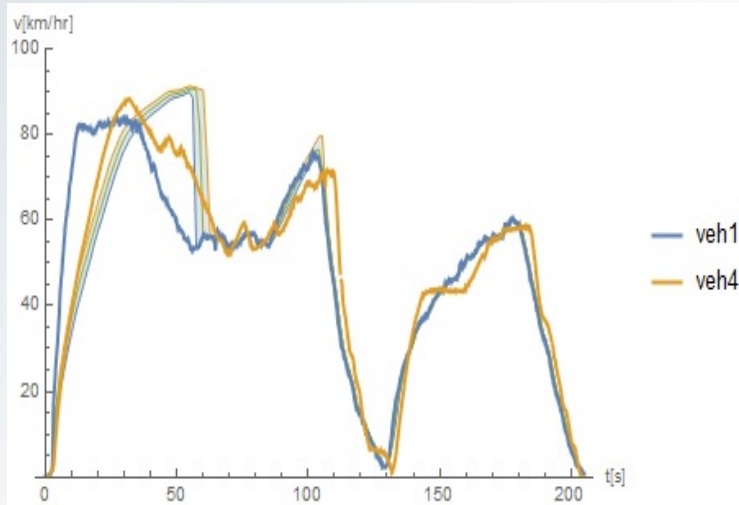
Vehicle 4

Vehicle 4, Segment 3, Small Variance

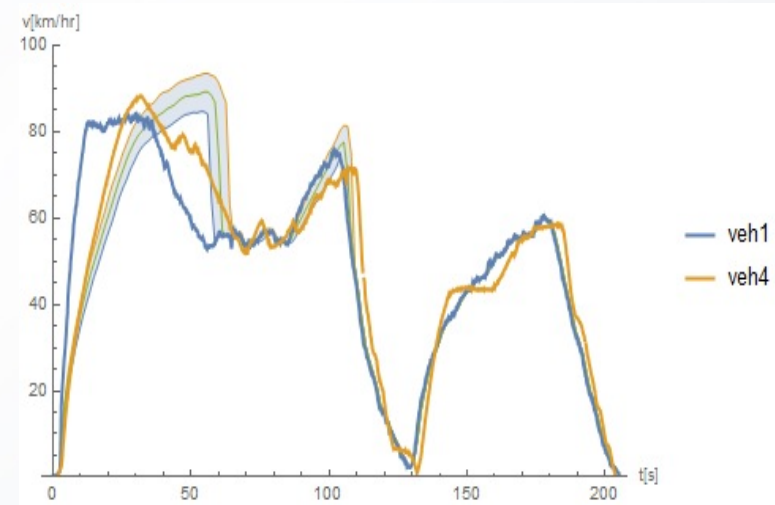
- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion



Brownian Motion

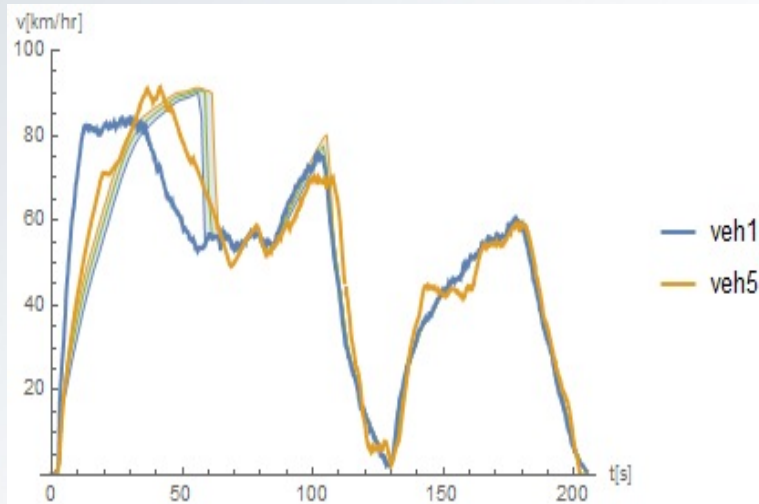


Vehicle 5, Segment 3, Small Variance

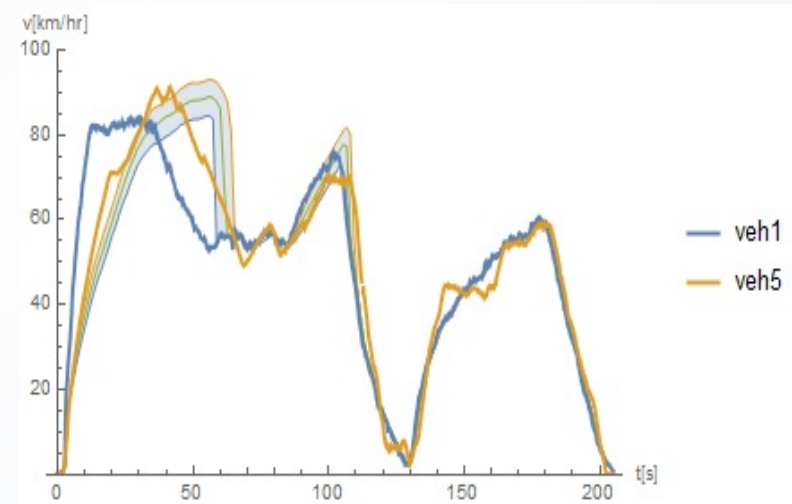
- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion



Brownian Motion

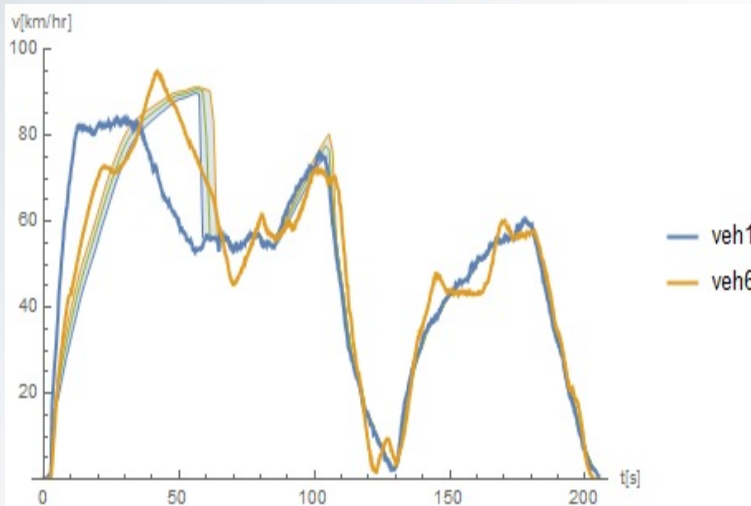


Vehicle 6, Segment 3, Small Variance

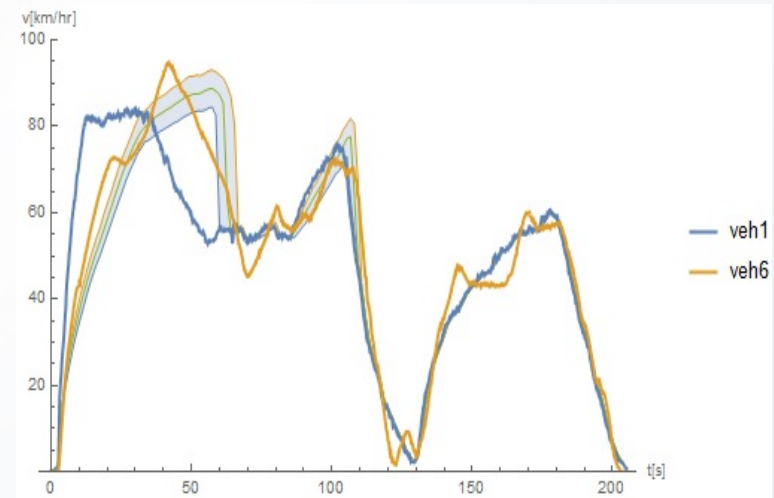
- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion



Brownian Motion



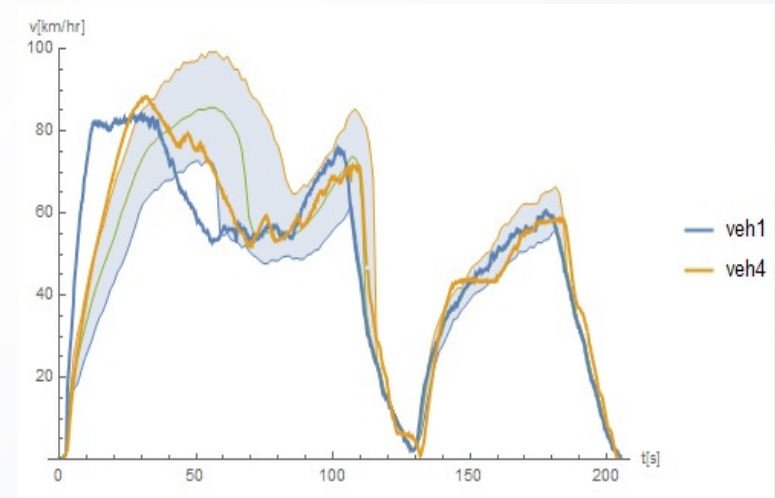
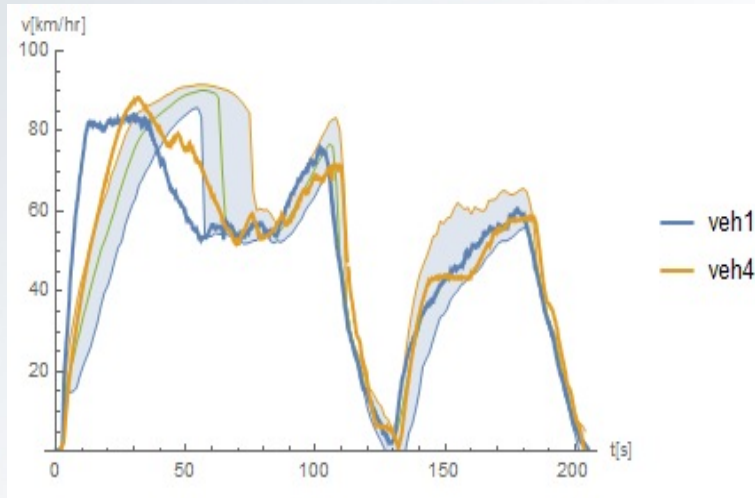
Vehicle 4, Segment 3, Large Variance

- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion

Brownian Motion

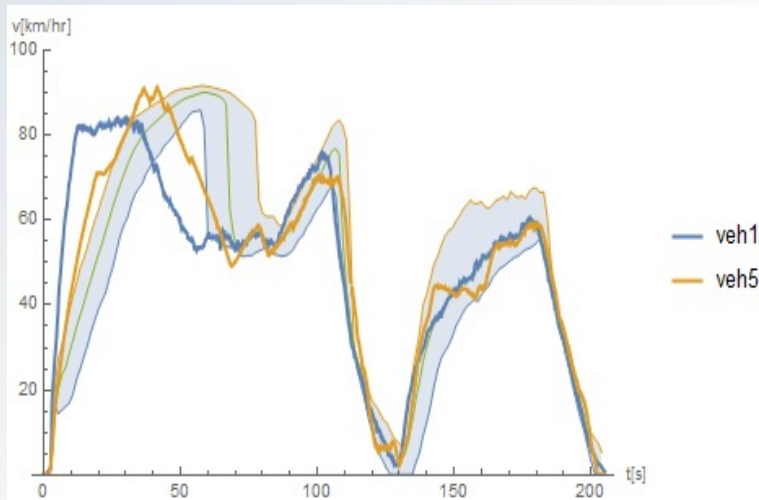


Vehicle 5, Segment 3, Large Variance

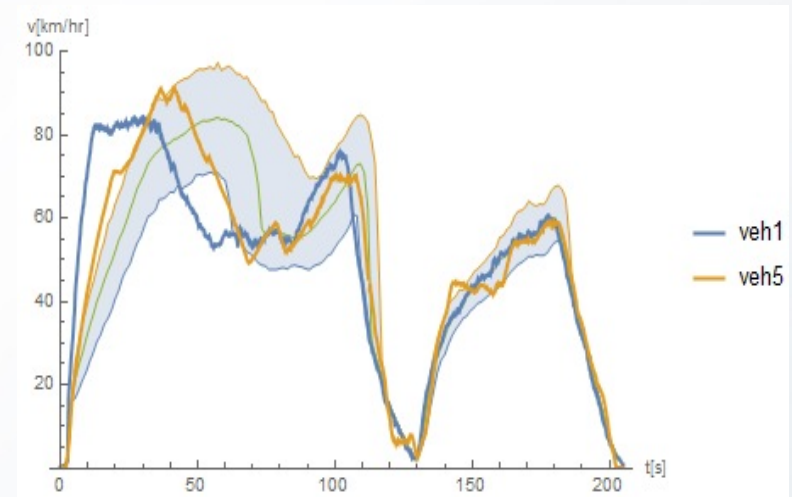
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Brownian Motion

Geometric Brownian Motion



Brownian Motion

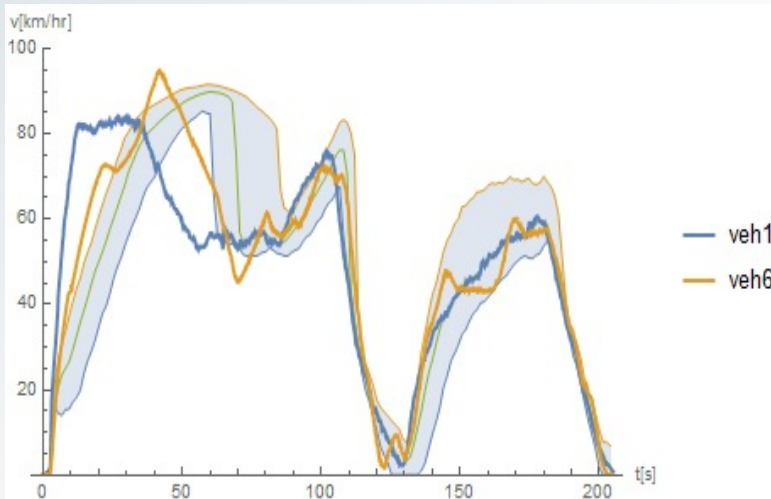


Vehicle 6, Segment 3, Large Variance

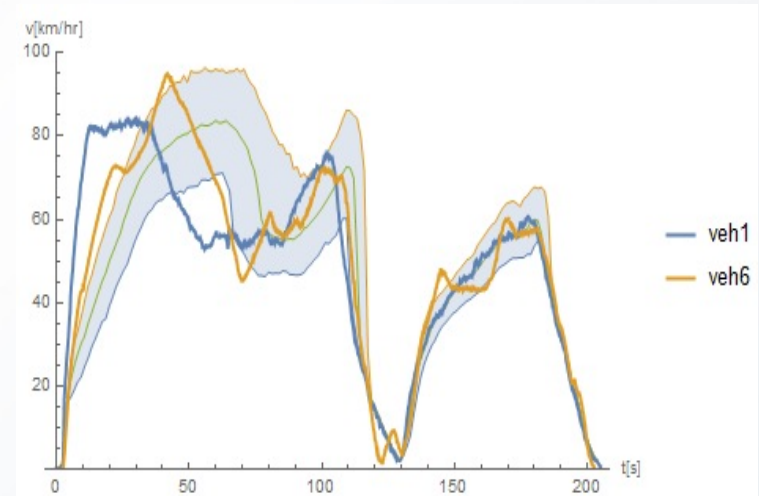
- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion



Brownian Motion



Q & A

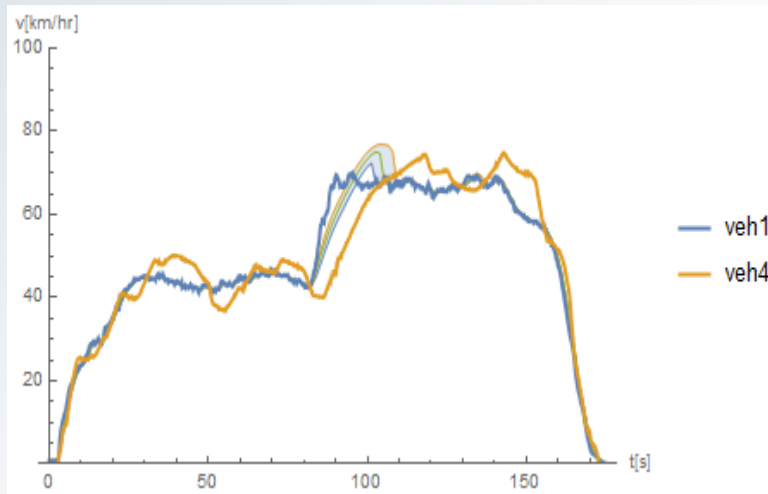
THANK YOU !

Vehicle 4, Segment 4, Small Variance

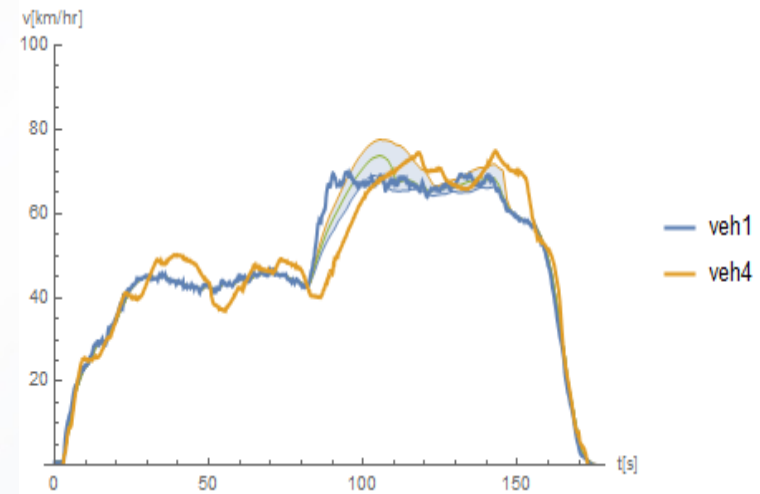
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Brownian Motion

Geometric Brownian Motion



Brownian Motion



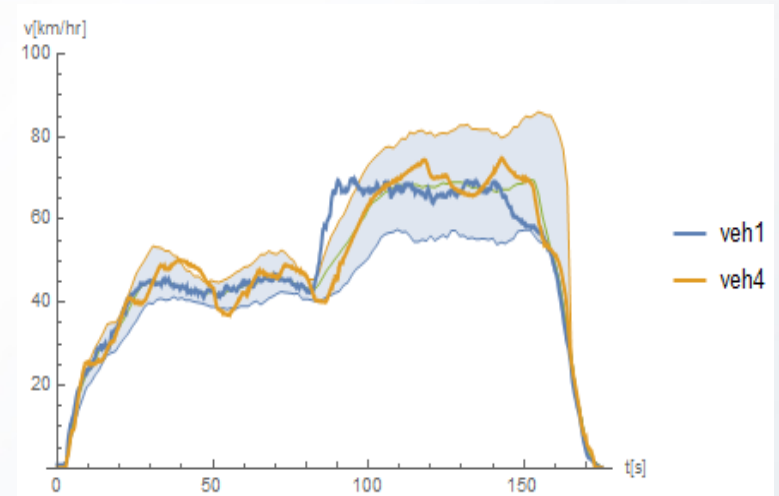
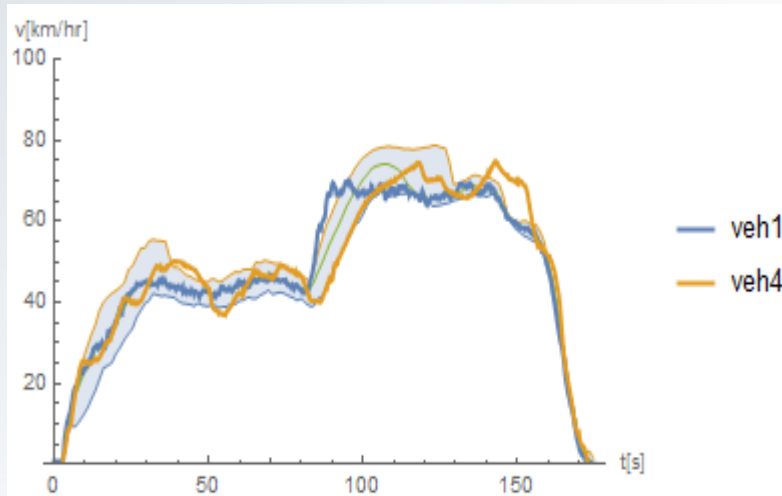
Vehicle 4, Segment 4, Large Variance

- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion

Brownian Motion



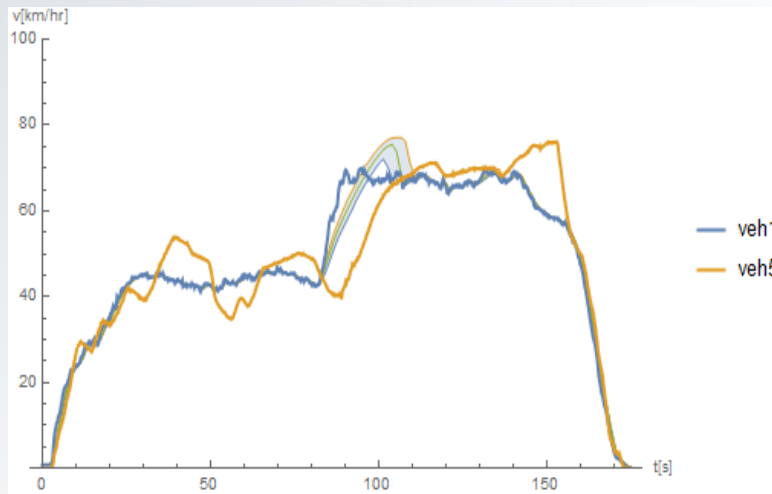
Vehicle 5

Vehicle 5, Segment 4, Small Variance

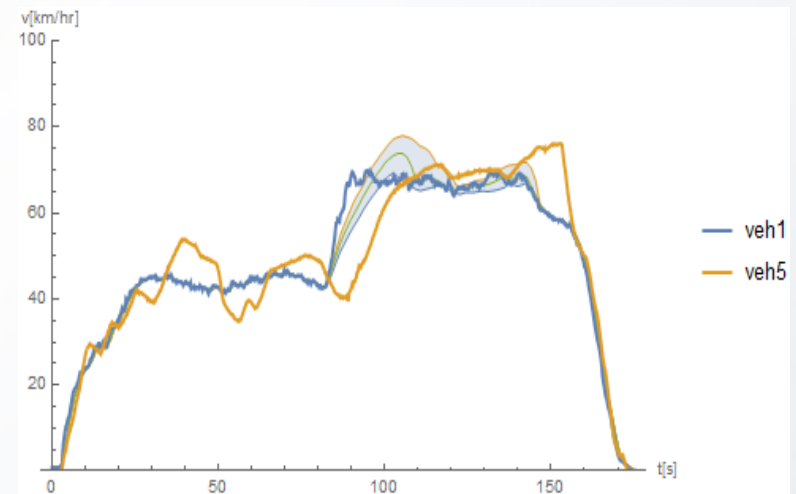
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Brownian Motion

Geometric Brownian Motion



Brownian Motion



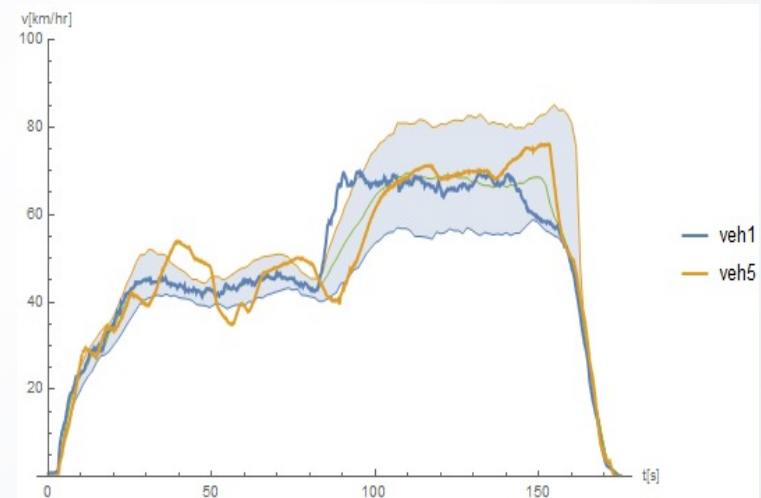
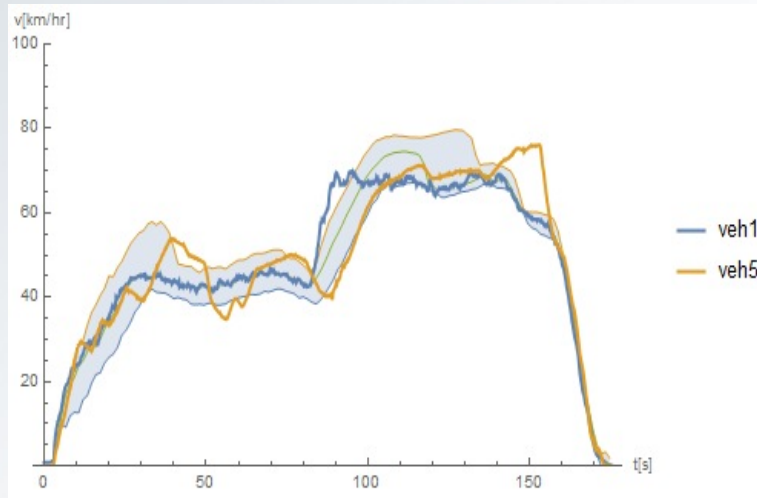
Vehicle 5, Segment 4, Large Variance

- Geometric Brownian Motion

Brownian Motion

Geometric Brownian Motion

Brownian Motion

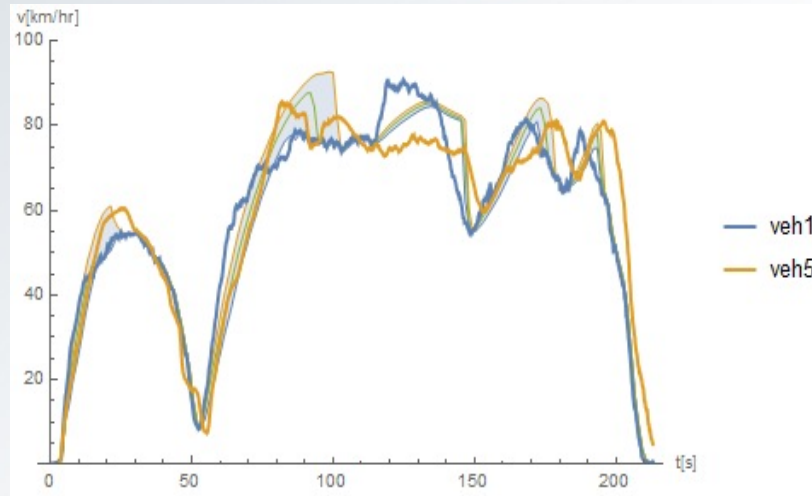


Vehicle 5, Segment 6, Small Variance

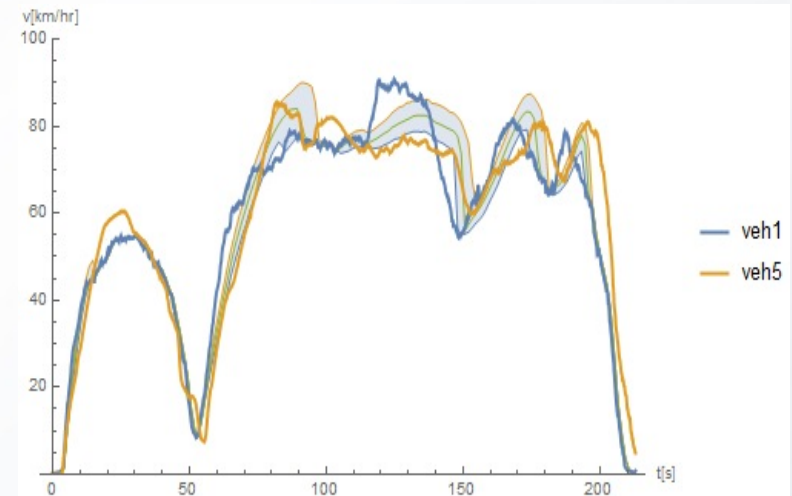
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Brownian Motion

Geometric Brownian Motion



Brownian Motion

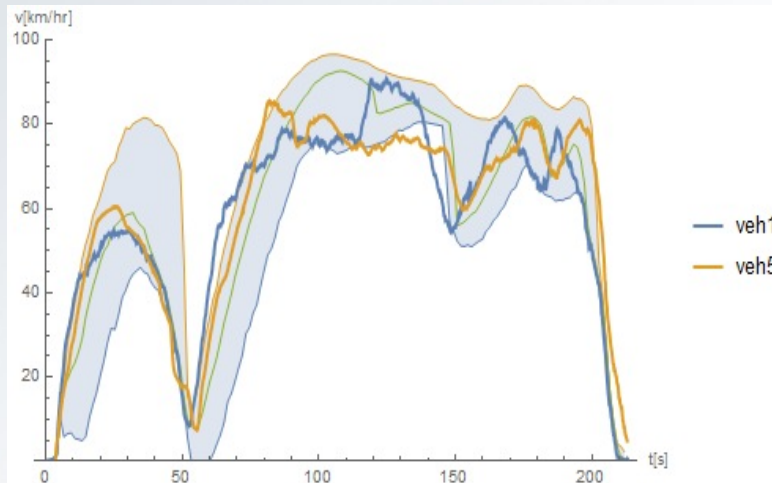


Vehicle 5, Segment 6, Large Variance

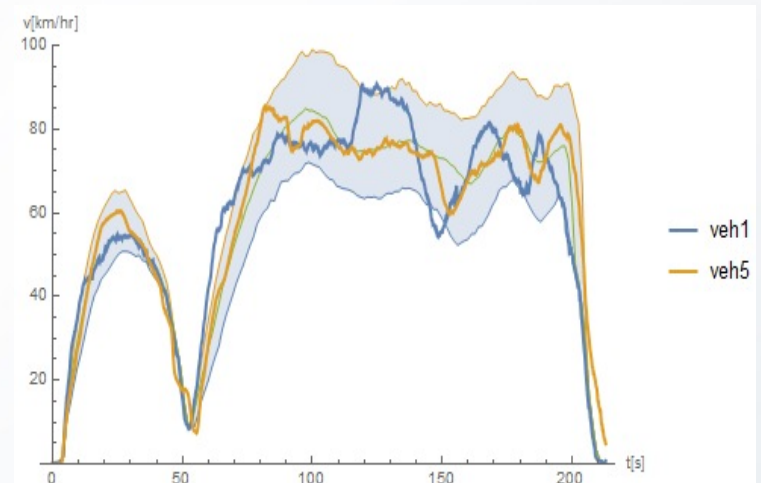
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Brownian Motion

Geometric Brownian Motion



Brownian Motion



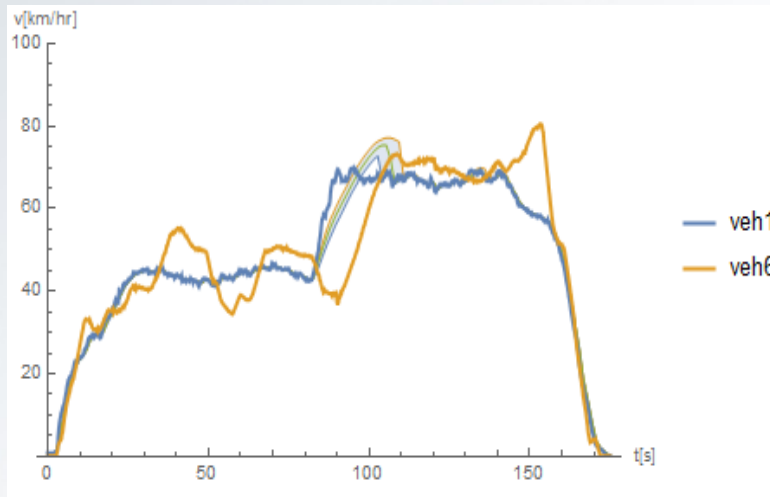
Vehicle 6

Vehicle 6, Segment 4, Small Variance

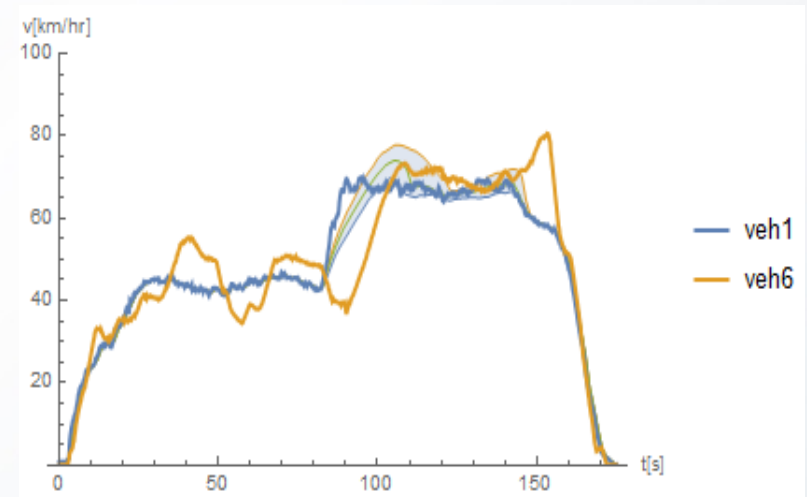
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Brownian Motion

Geometric Brownian Motion



Brownian Motion



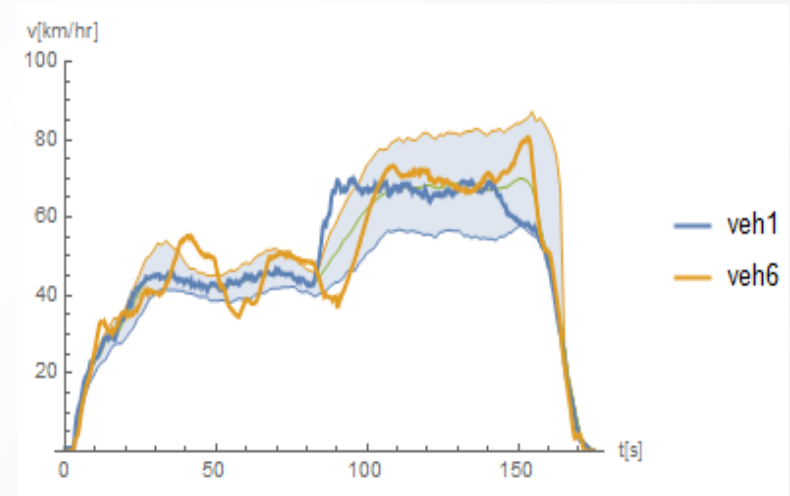
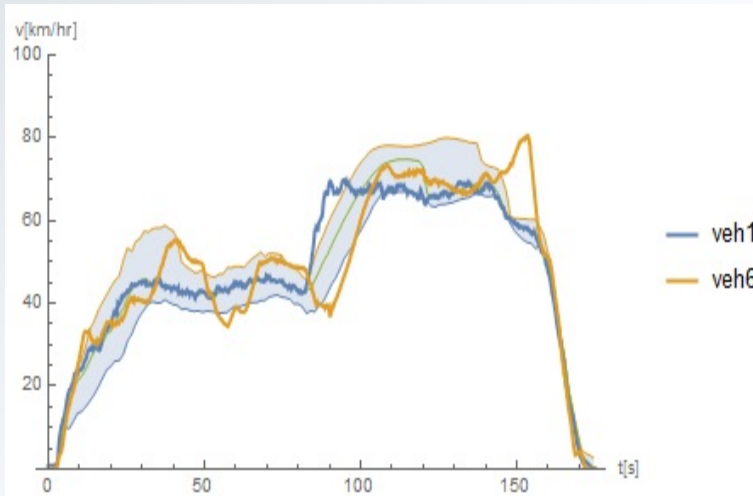
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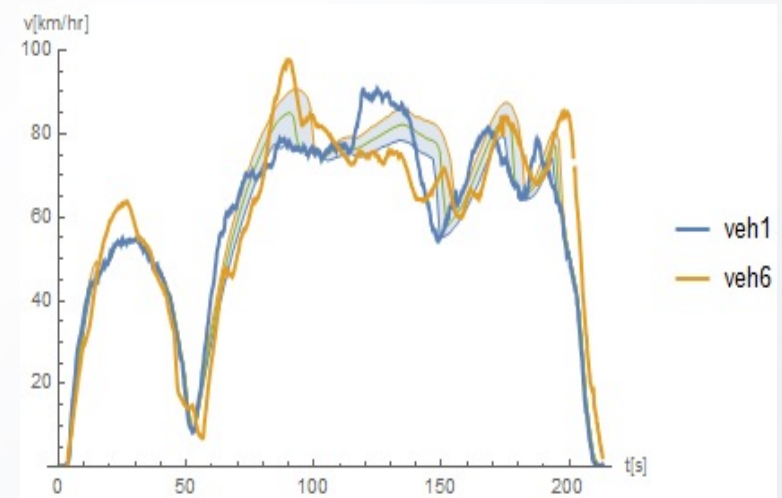
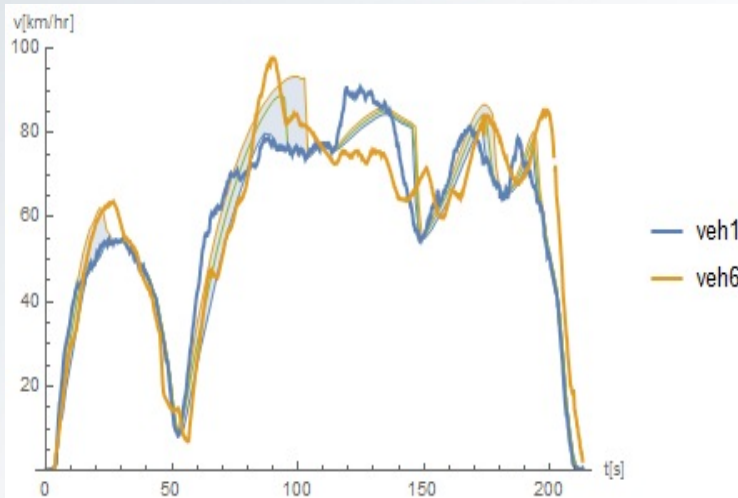
Vehicle 6, Segment 6, Small Variance

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