



**BICYCLE TRAFFIC SIMULATION:
A POWER-BASED APPROACH TO
MODEL THE IMPACT OF GRADIENT
IN BICYCLE TRAFFIC SIMULATION**

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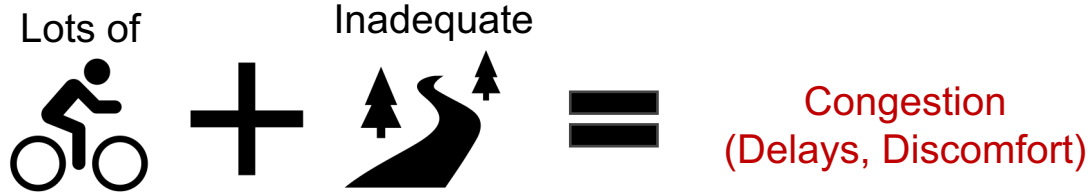
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BACKGROUND

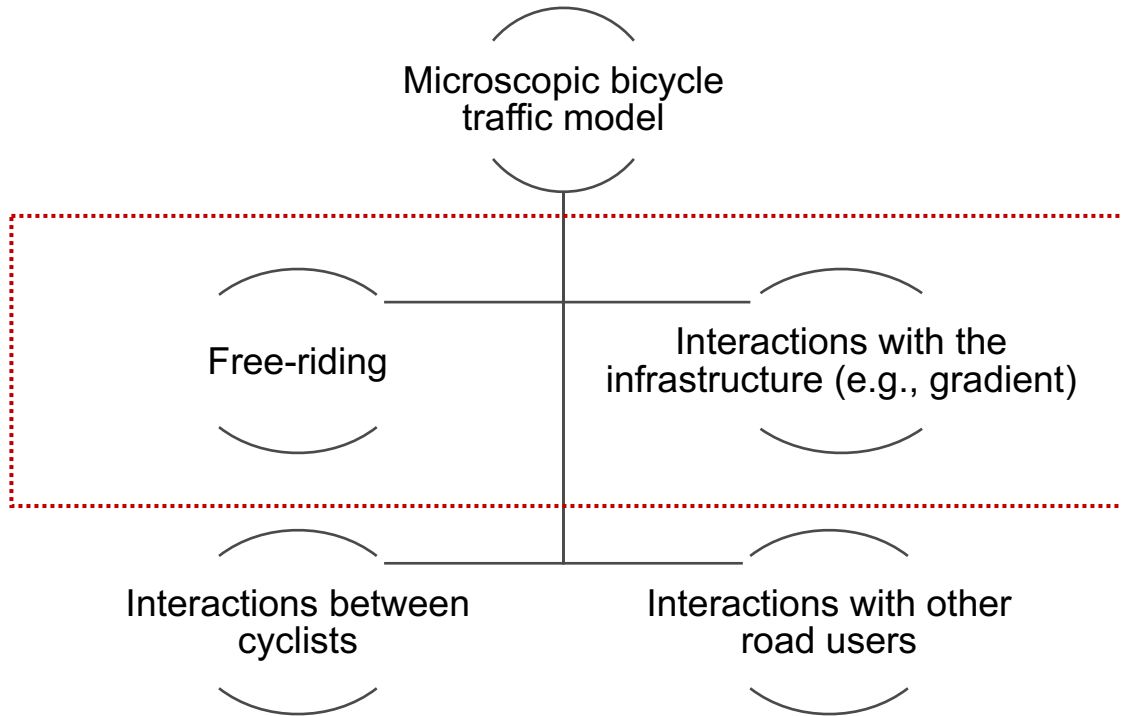
- We want more people cycling!



- PhD project on bicycle traffic simulation.
 - Need for traffic modelling support for bicycle traffic.
 - A microscopic traffic simulation approach .
 - High heterogeneity in bicycle traffic.
 - Scope: off-street bicycle path segments.

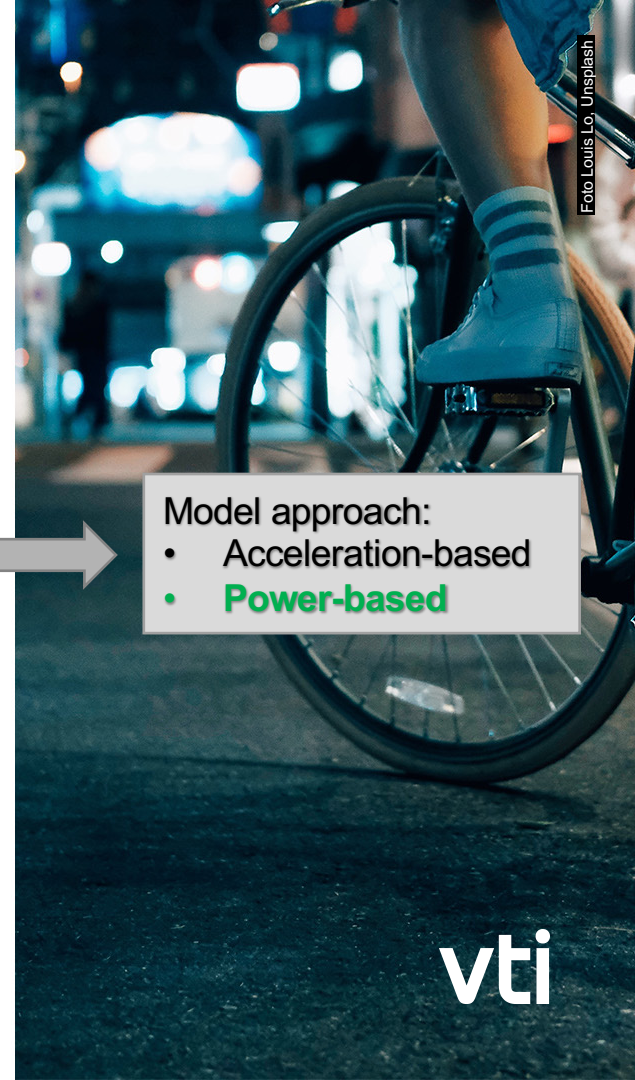


Purpose of the PhD project: to investigate, develop, and evaluate microscopic traffic models for simulating the behavior of cyclists.



Model approach:

- Acceleration-based
- **Power-based**



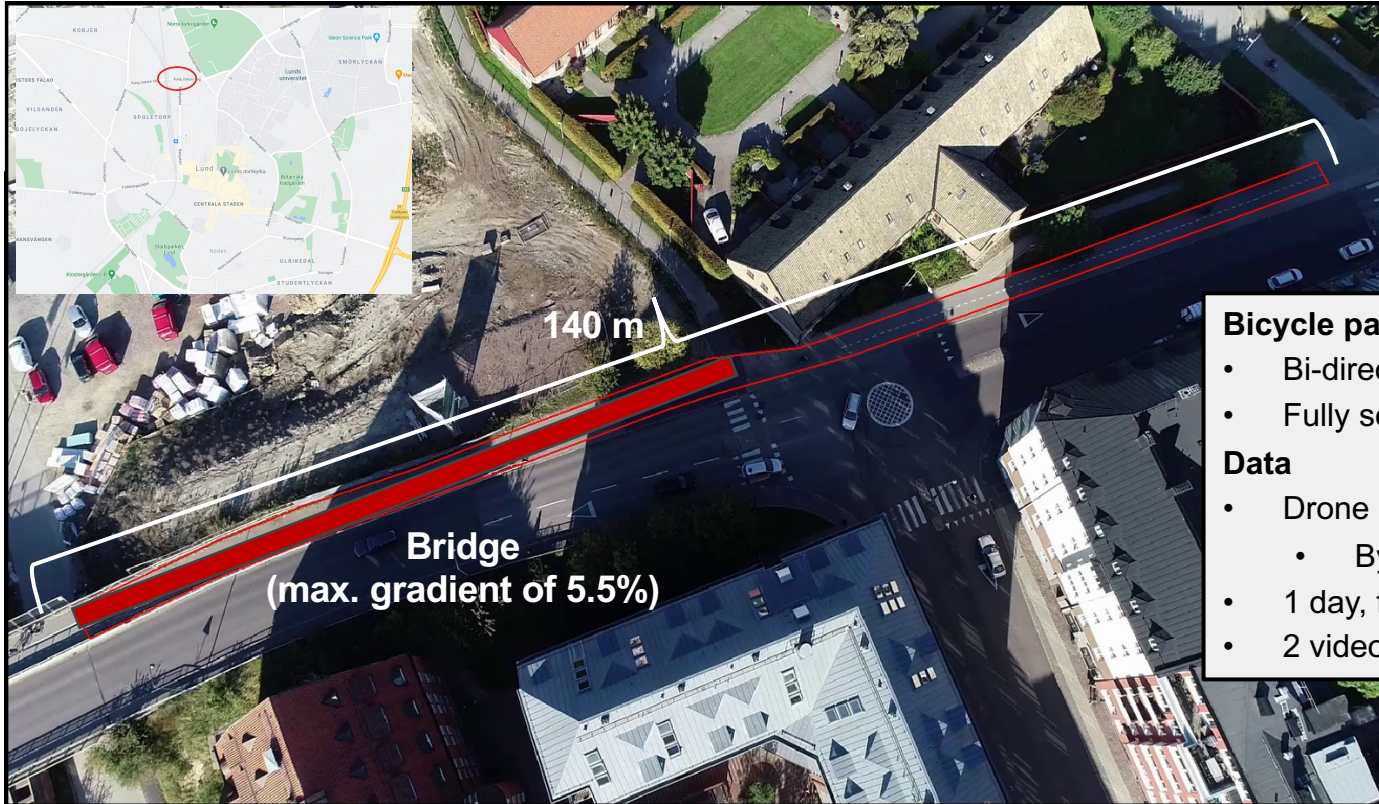
PURPOSE

- To investigate the connection between gradient and the power output in a population of cyclists.
- Towards developing a power-based modelling approach to simulate free-riding on path segments, considering:
 - The impact of gradient.
 - The heterogeneity of bicycle traffic.



DATA COLLECTION

Kung Oskars bro, Lund



Bicycle path

- Bi-directional (3-meter-wide)
- Fully separated from car traffic

Data

- Drone (Phantom 4 Pro V2.0)
 - By Lund University
- 1 day, from 14 h to 15 h
- 2 videos, 20 min each

FINDING FREE CYCLISTS

Free cyclist:

- A cyclist who at no point have a headway < 2 s.

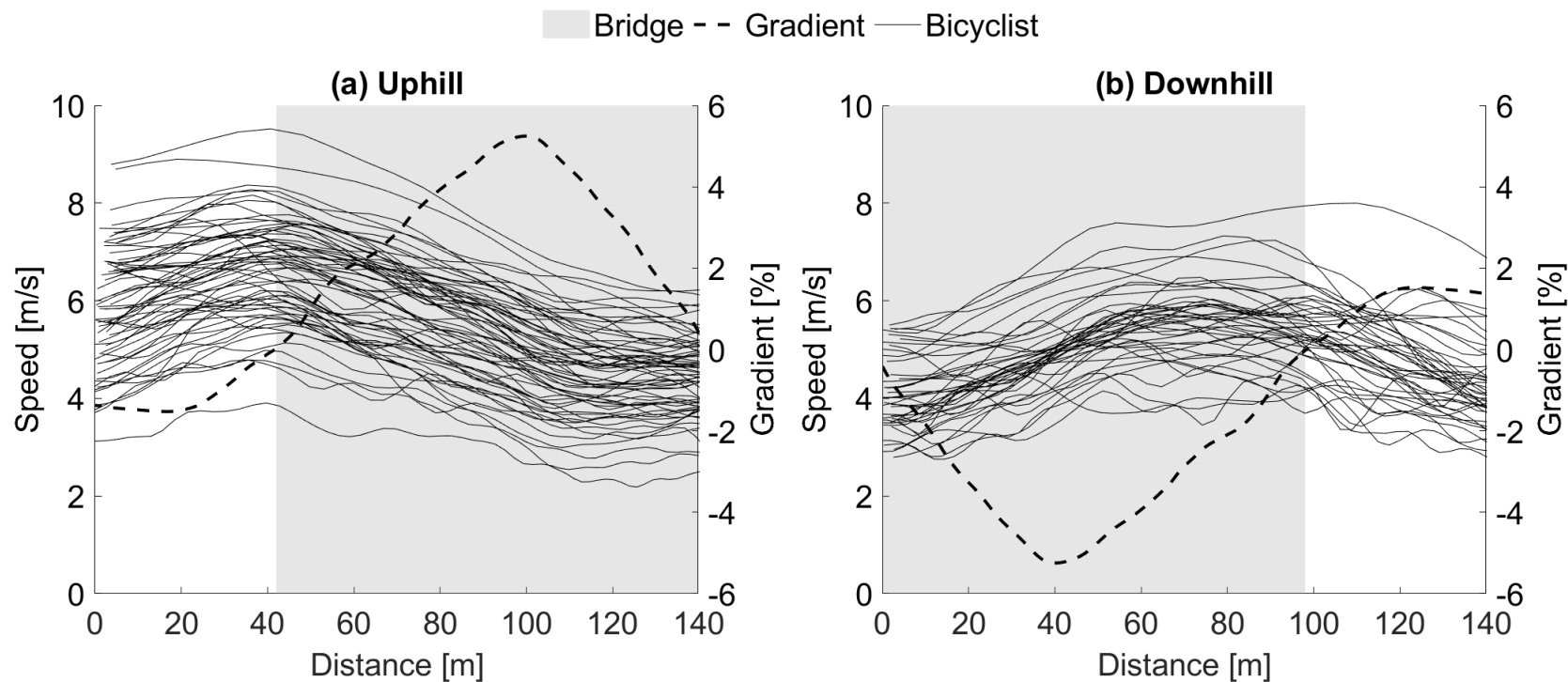
Other criteria:

- Riding on bicycle path
- Riding straight through (no turnings)

Travel direction	All	Free cyclists
Westbound (uphill)	135	65
Eastbound (downhill)	86	42

Total = 107

SPEED



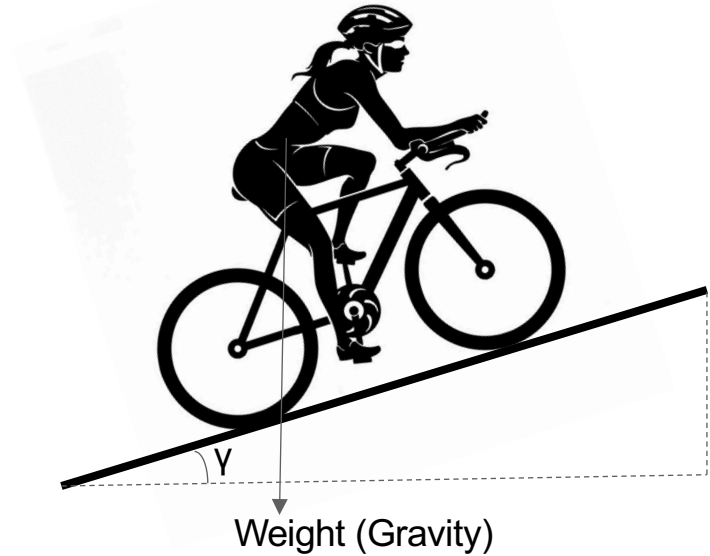
A POWER-BASED MODEL

Martin et al (1998) – To estimate power output considering bicycle dynamics

Free-riding on flat segments



Free-riding on non-flat segments



COMPUTATION OF **RELATIVE** POWER OUTPUT

Properties equal for all cyclists



Total mass = weight of cyclist + weight of bicycle

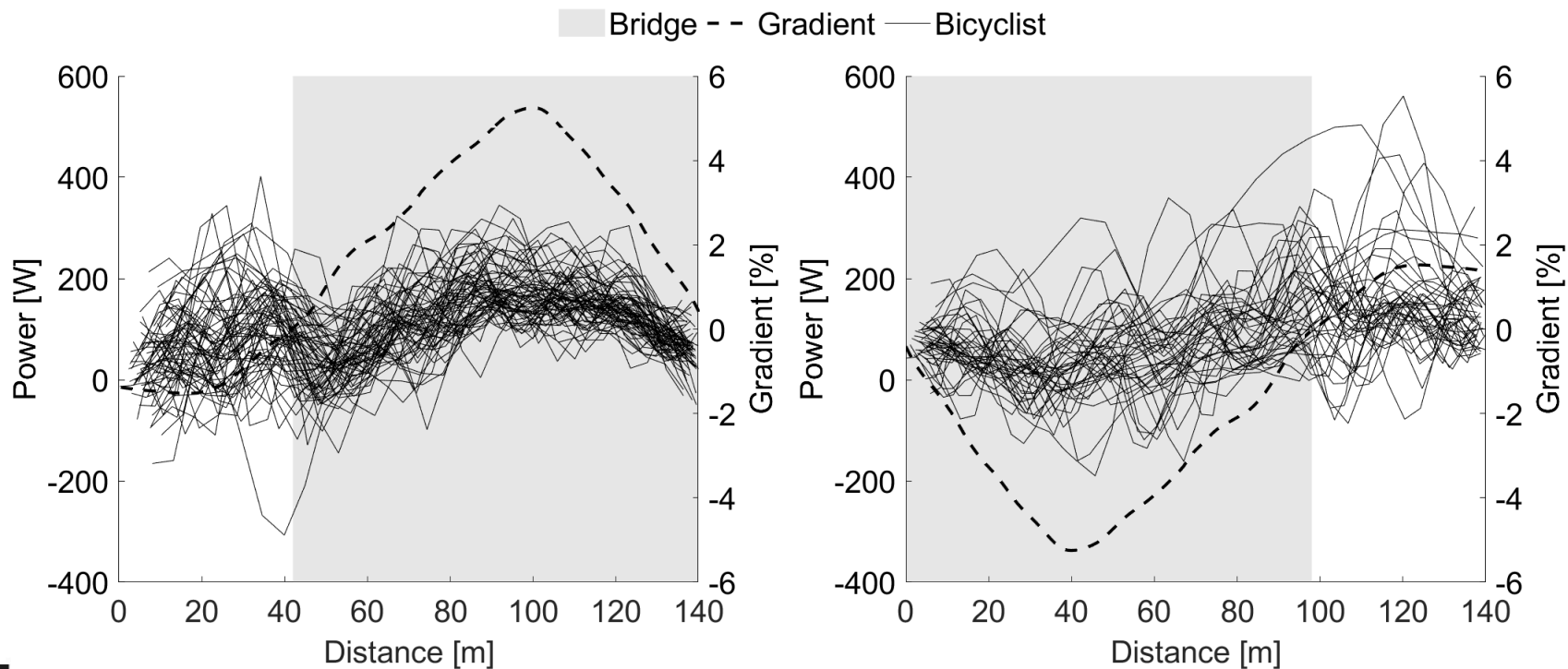
Mechanical properties of the bicycle: frictional losses in the drive chain and wheel bearing systems.

Rolling resistance: coefficient of rolling resistance.

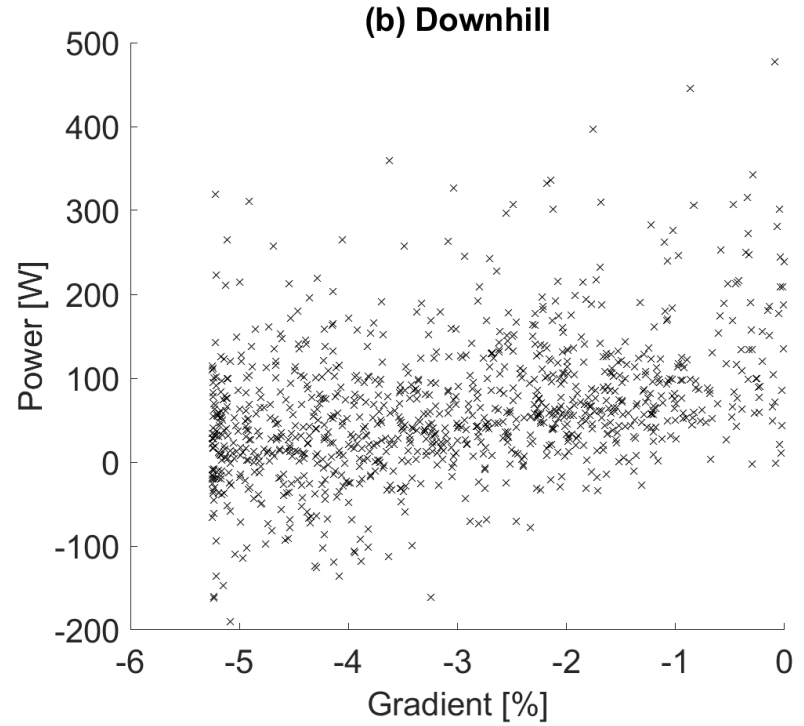
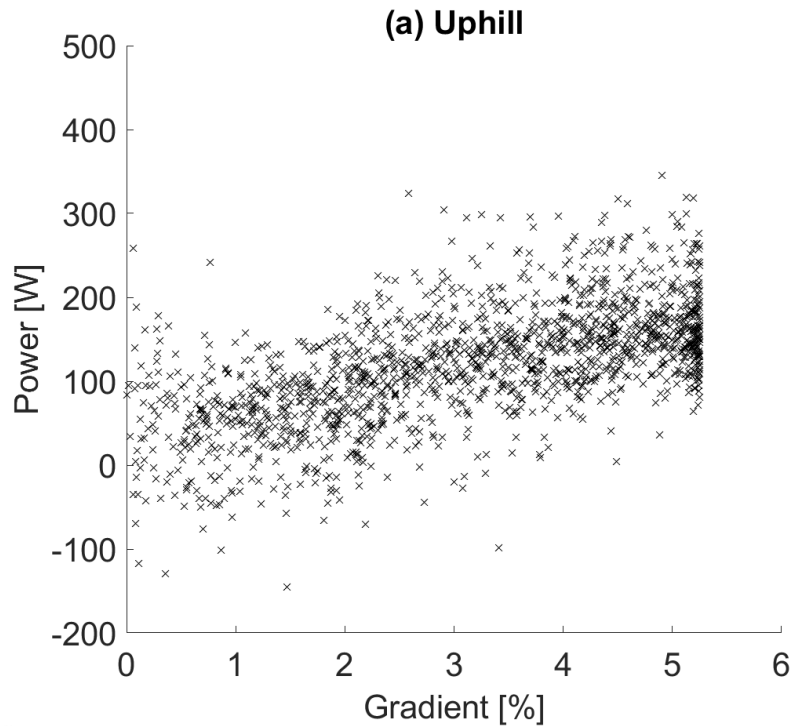


Aerodynamics: air density, drag coefficient, wind speed and direction, etc.

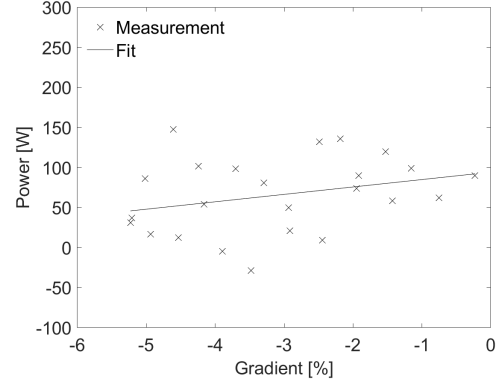
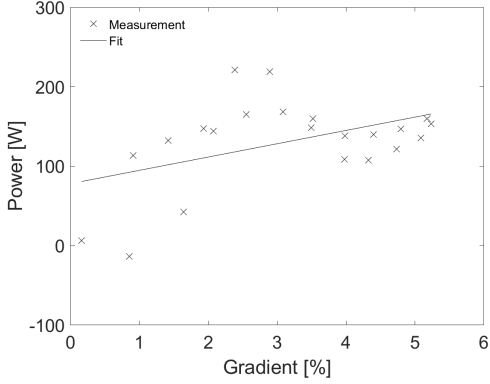
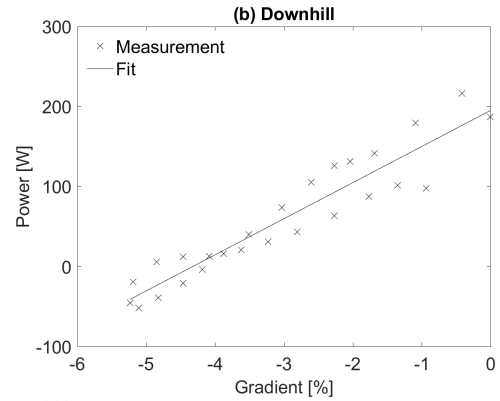
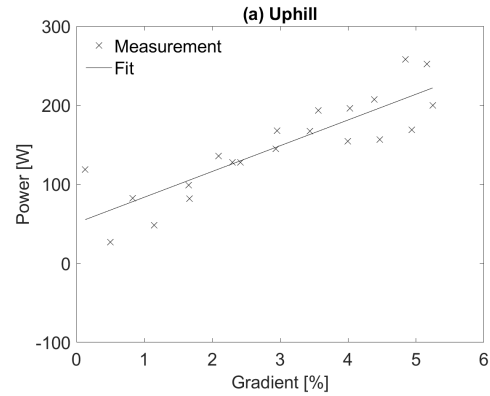
POWER OUTPUT



POWER OUTPUT VS GRADIENT



POWER OUTPUT VS GRADIENT (INDIVIDUAL)



MODEL ESTIMATION

- Estimate relative power output as a function of gradient (γ), at current wind speed ($v_a = 5$ m/s)

$$p_{pedal} = p_0 + p_1\gamma$$

- p_0 : desired power output
 - power necessary to maintain v_o when $\gamma = 0$
- p_1 : desire (or ability) to ride (or compensate) for the uphill/downhill
- Estimate an individual linear model for each cyclist, with parameters p_0 and p_1

SIMULATION ALGORITHM

1. Compute changes in the kinetic energy (P_k) (conservation of energy)

$$P_k = p_{pedal} - p_{grad} - \sum_{j \in J} p_j$$

Where:

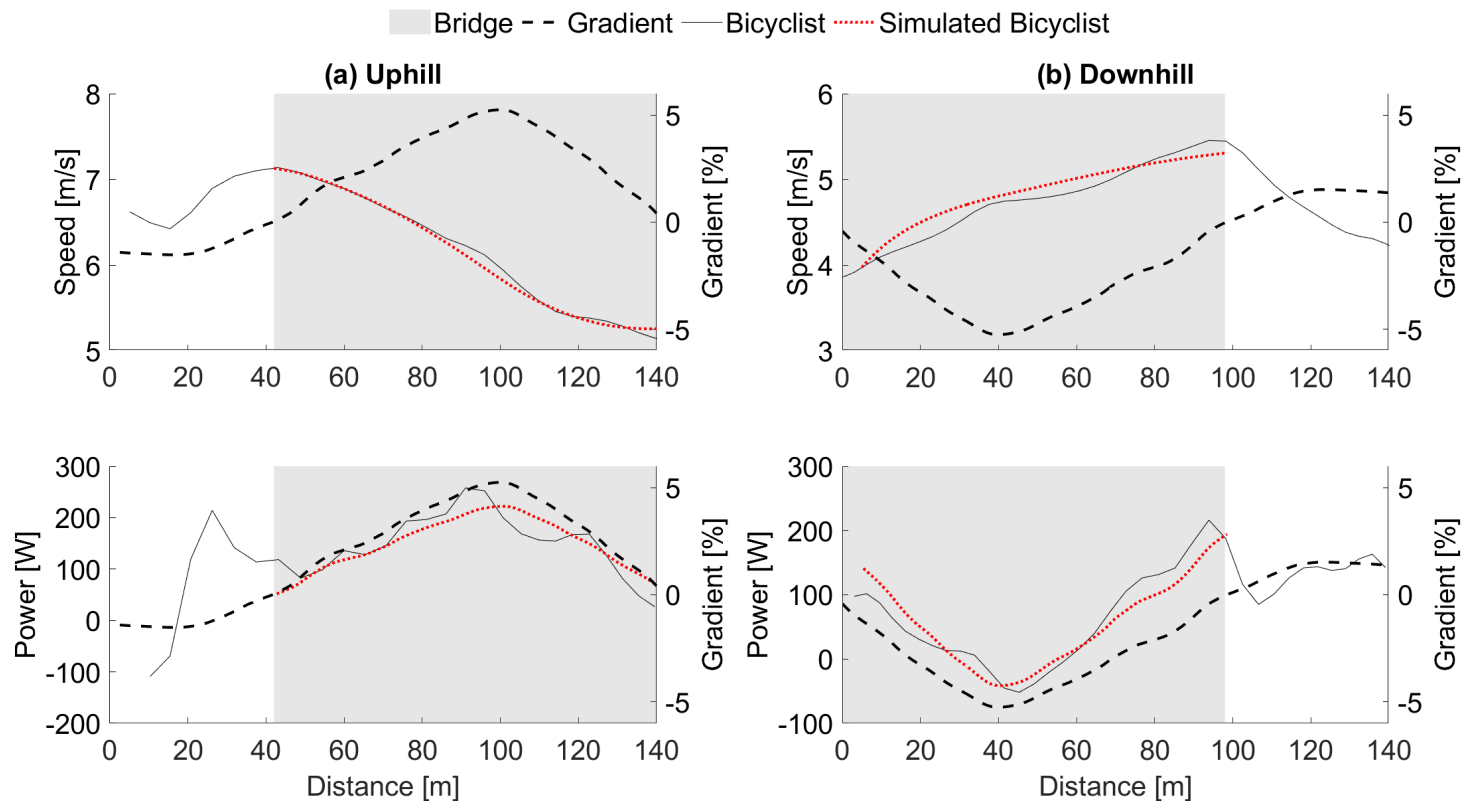
- p_{grad} represents changes in the potential energy, $\gamma(x_i)$
- J is the set of types of losses in power, namely
 - aerodynamic resistance,
 - rolling resistance, and
 - wheel bearing friction

2. Compute speed (v_i) based on kinetic energy equation

3. Update position (x_i)

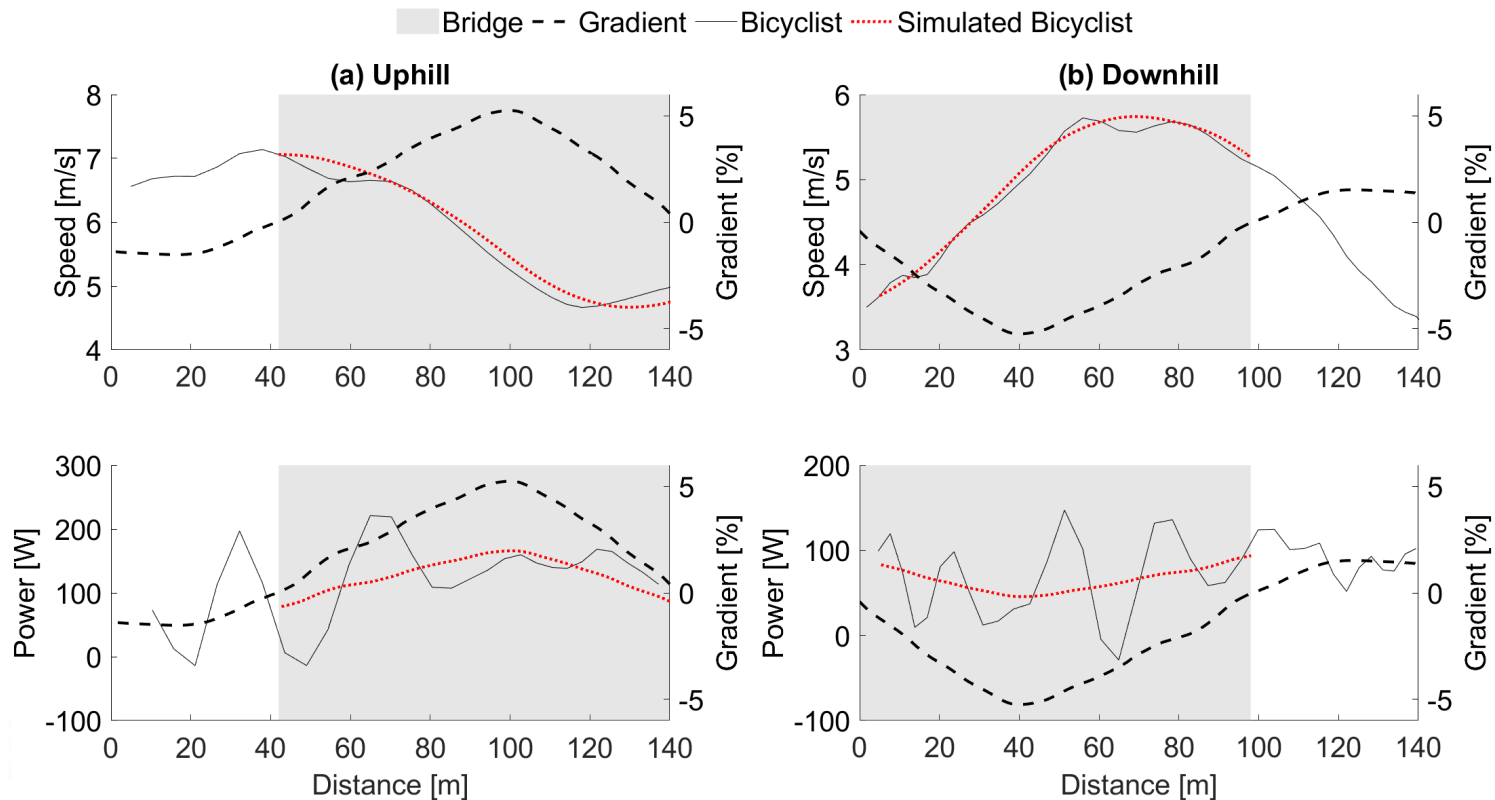
SIMULATION

Cyclists with a high R-Squared model.



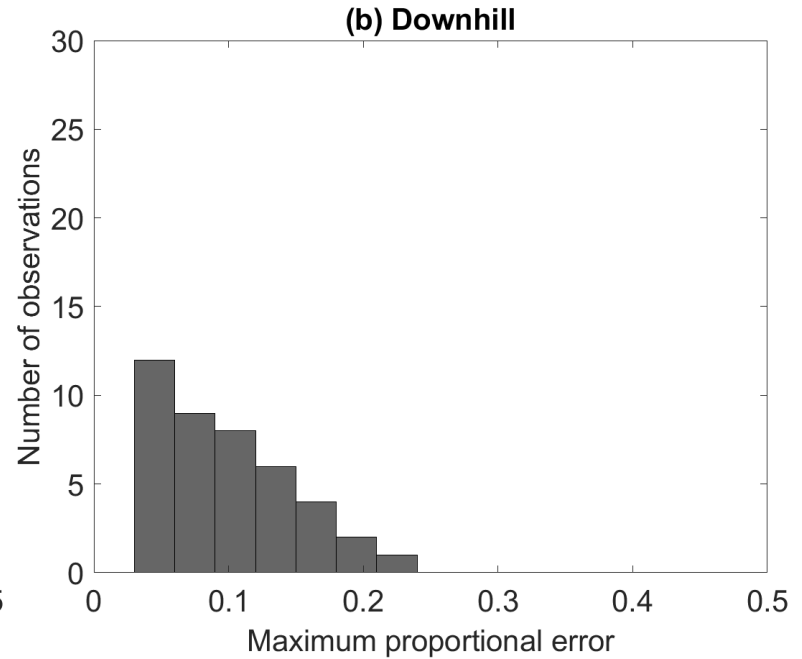
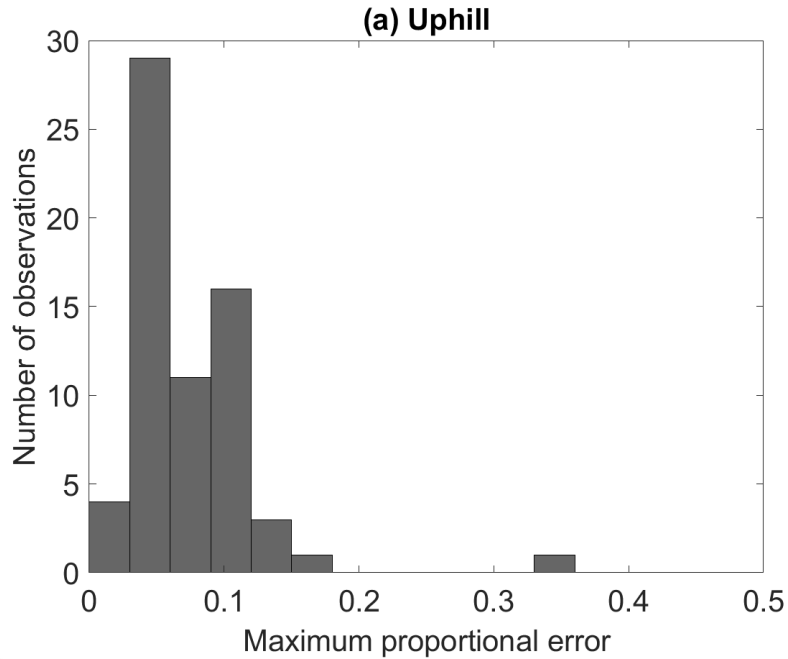
SIMULATION

Cyclists with a low R-Squared model.



ESTIMATION ERROR IN SPEED PROFILES

Based on maximum (proportional) deviation between observed and simulated speed profiles



CONCLUSIONS

- Power is not constant in free-riding on non-flat paths
 - Cyclists adapt to cope with the uphill/downhill
- A linear model of power output as a function of gradient fits well on the uphill
 - ... and to some extent on the downhill.
- The impact of gradient may vary greatly among bicyclists.
 - Uncertainties remain due to assumptions to estimate power output.
- A power-based model approach seems suitable for simulating bicycle traffic.

FUTURE RESEARCH

- Domain of applicability of the presented linear model
 - Magnitude and length of the non-flat segment.
- Coasting and braking behavioral patterns.
- Transitions between uphill/downhill (tactical behavior).
- Relation power and energy expenditure (effort).
 - Trade-offs between time/speed and effort.
- Adding other elements of infrastructure/environment in connection to free-riding.
 - Aerodynamic resistance, horizontal curvature, etc.

■ Thanks

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