

Road layout in the KPZ class

Growing out of a project that started with
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Aquib Molla

Márton Balázs

University of Bristol

Fluctuations for inhomogeneous last passage times
Sussex, September 2023.

A naive Poisson model

Last passage percolation

Our model

Questions

Answers

A naive Poisson model



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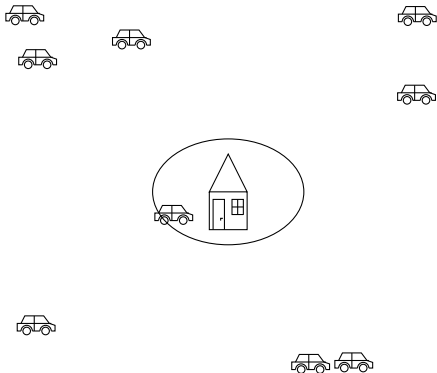
A naive Poisson model



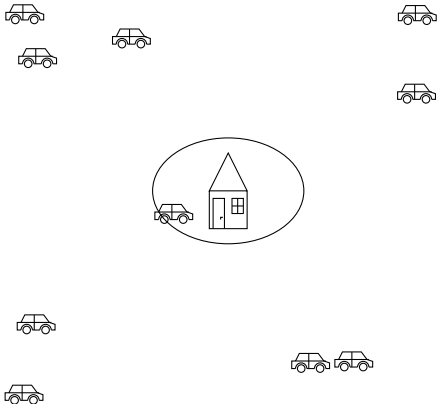
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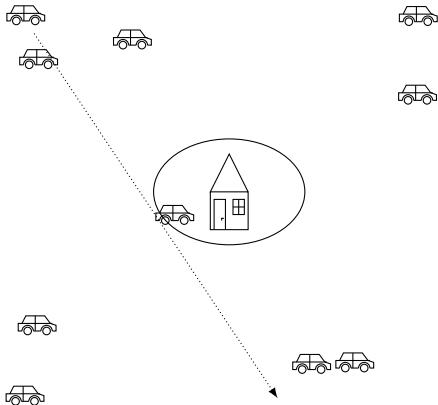
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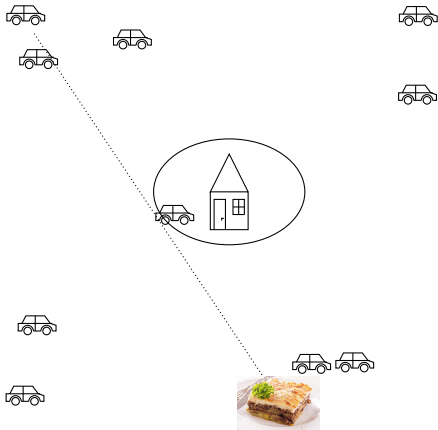
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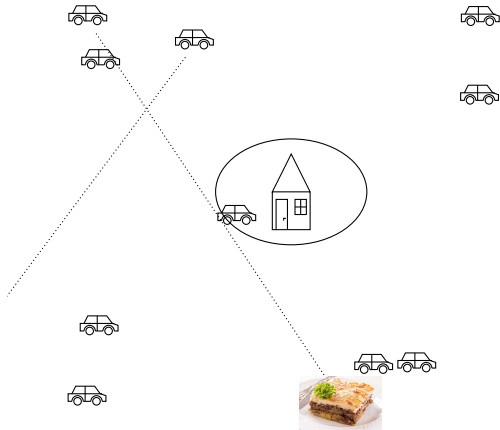
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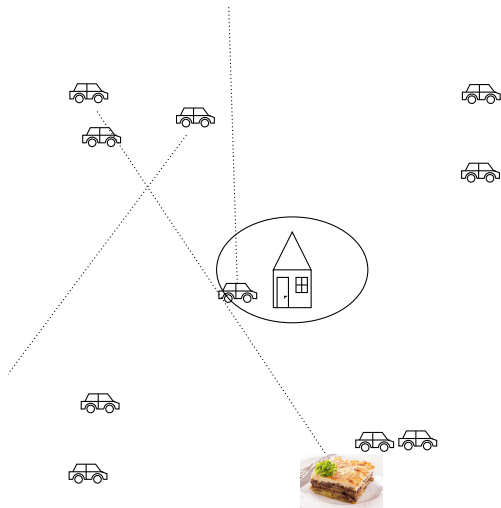
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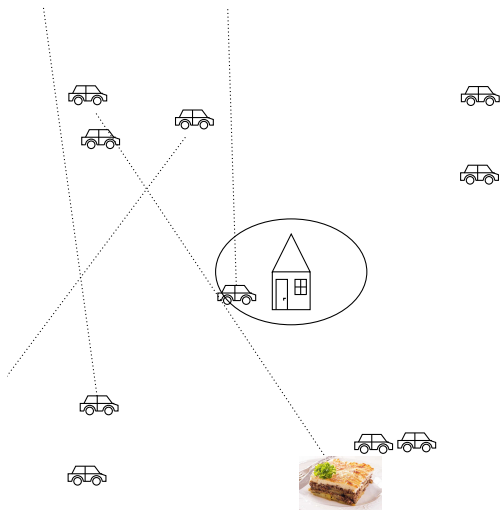
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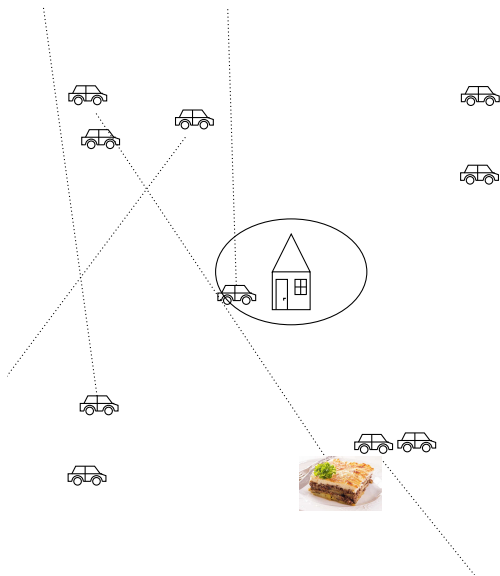
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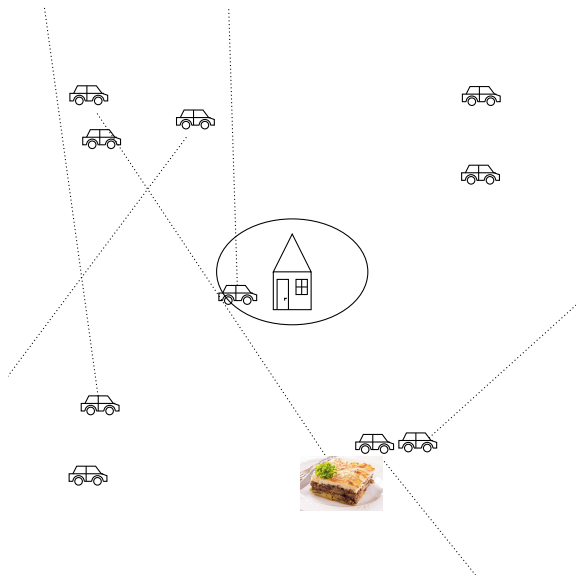
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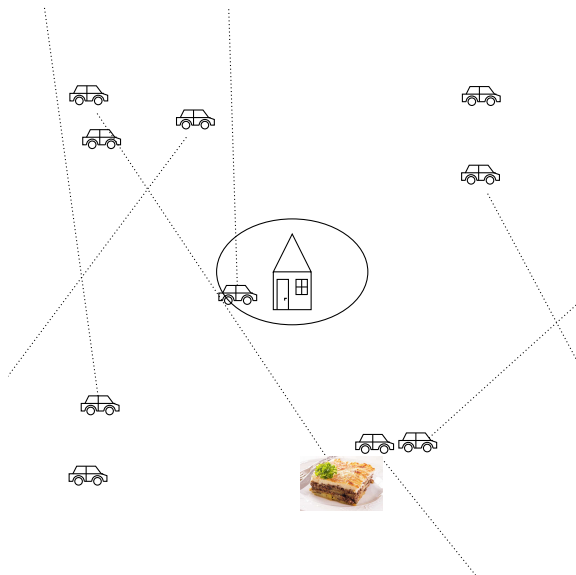
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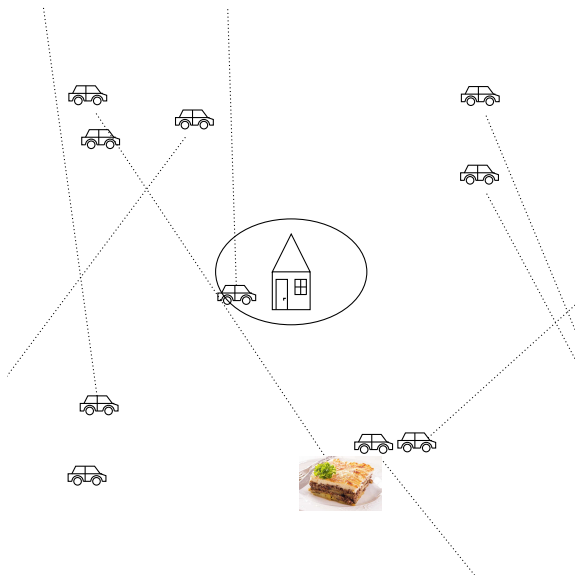
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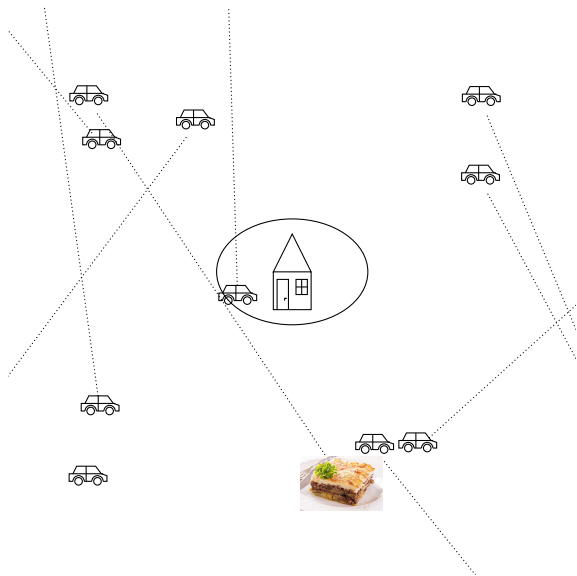
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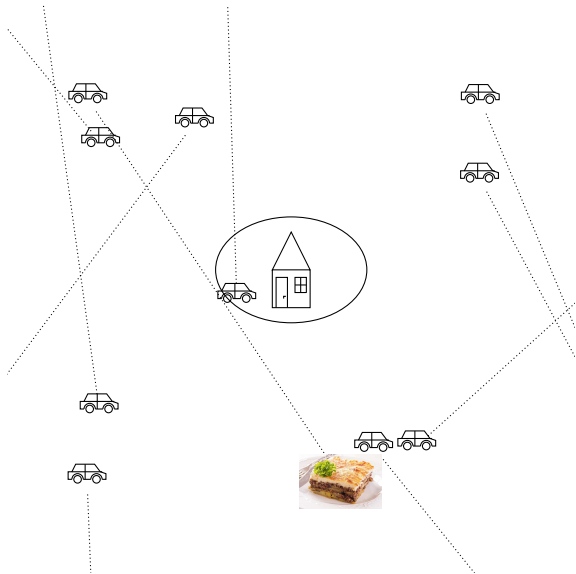
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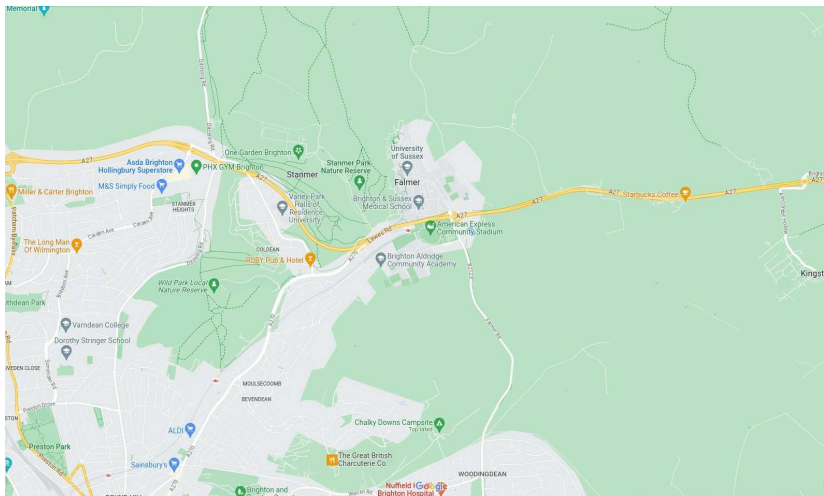
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- ▶ Unfortunately $D \gg r \dots$

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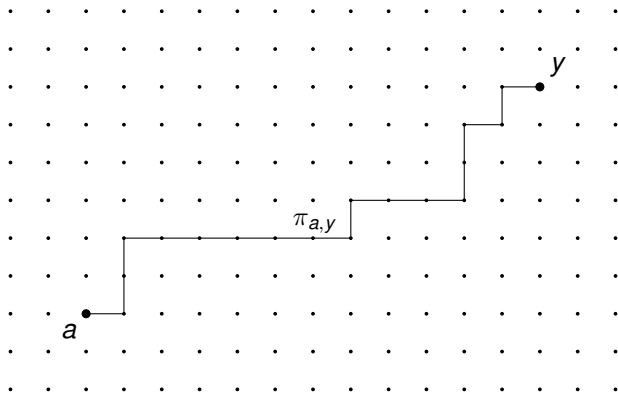
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- ▶ More tools in Exponential last passage percolation (LPP). Should behave similarly to FPP.

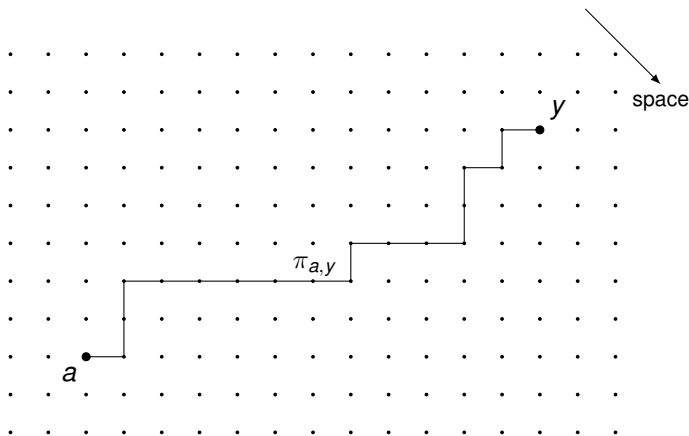
Last passage percolation

- ▶ Place ω_z i.i.d. $\text{Exp}(1)$ for $z \in \mathbb{Z}^2$.
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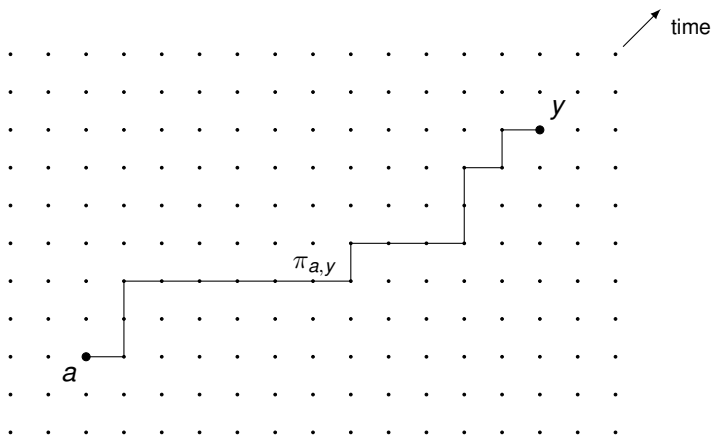
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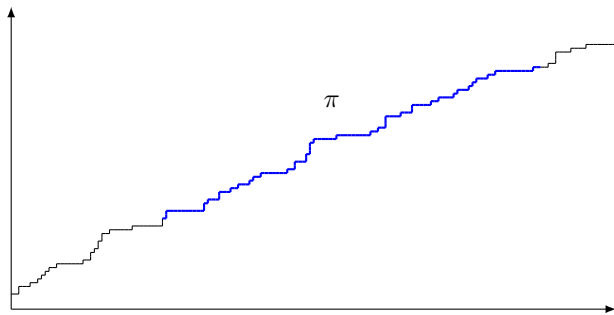
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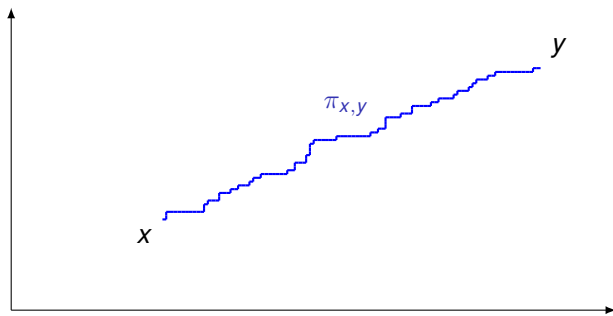
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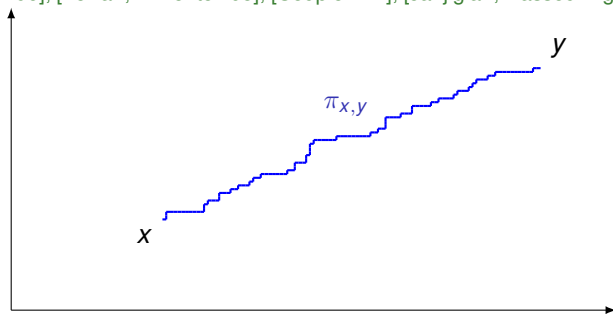
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For any fixed direction this a.s. exists and is unique. [Newman (et al) '96]; [Ferrari, Pimentel '05]; [Coupier '11]; [Janjigian, Rassoul-Agha, Seppäläinen '23]



Our model

- ▶ Throw i.i.d. $\text{Exp}(1)$ weights on \mathbb{Z}^2 .

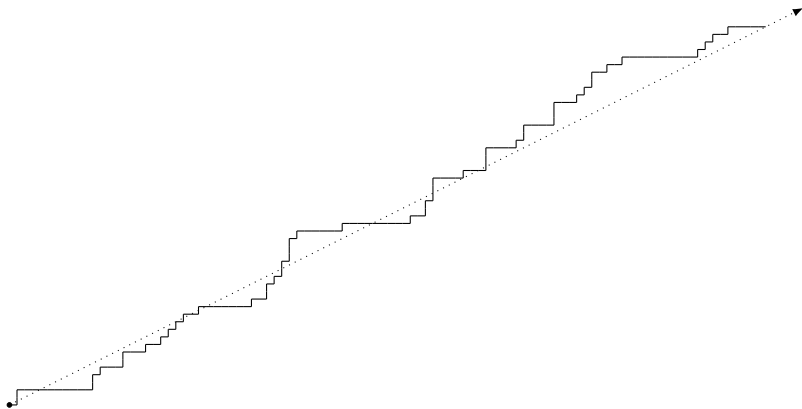
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- ▶ Throw i.i.d. $\text{Exp}(1)$ weights on \mathbb{Z}^2 .
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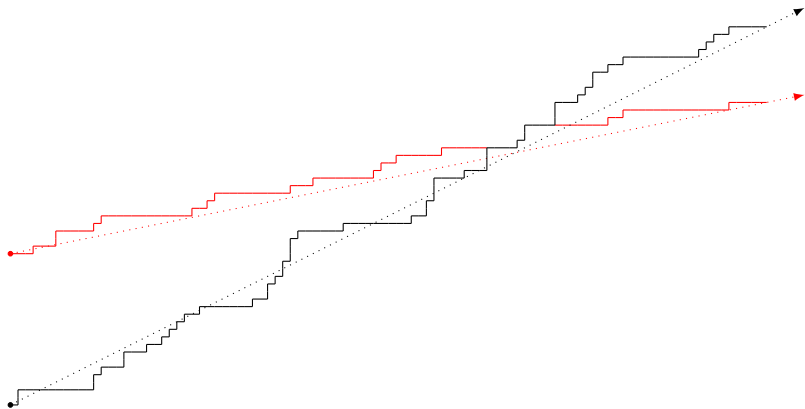
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- ▶ Draw the a.s. semi-infinite geodesic for each point to its chosen direction. Many of these will coalesce when the angles are close. **That's our road map with traffic data on it. A road segment is *busy* when many geodesics use that edge.**

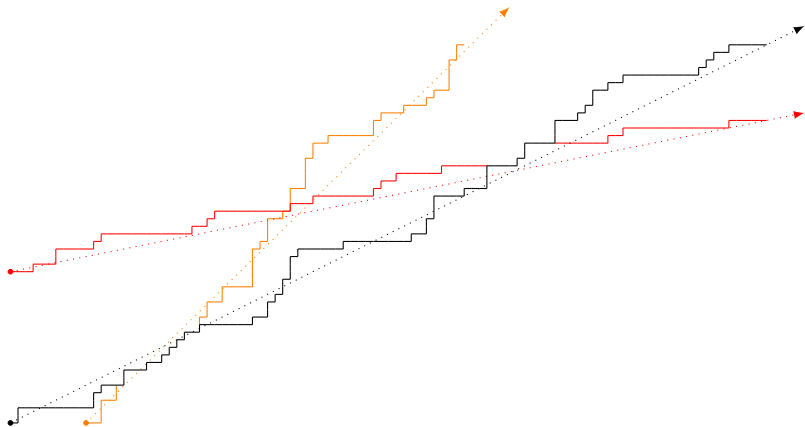
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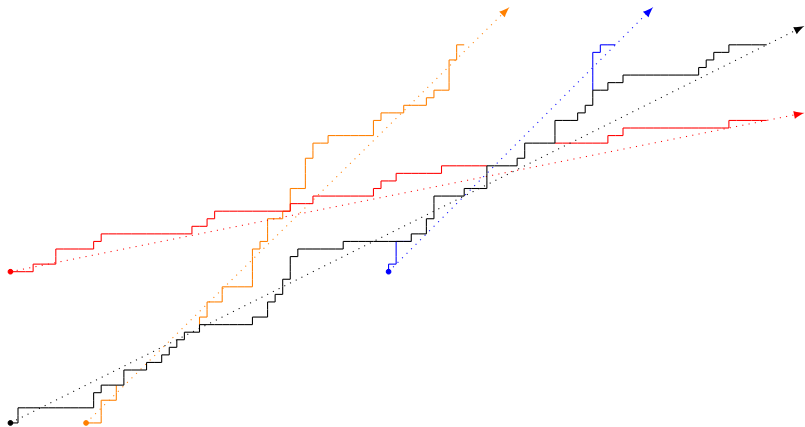
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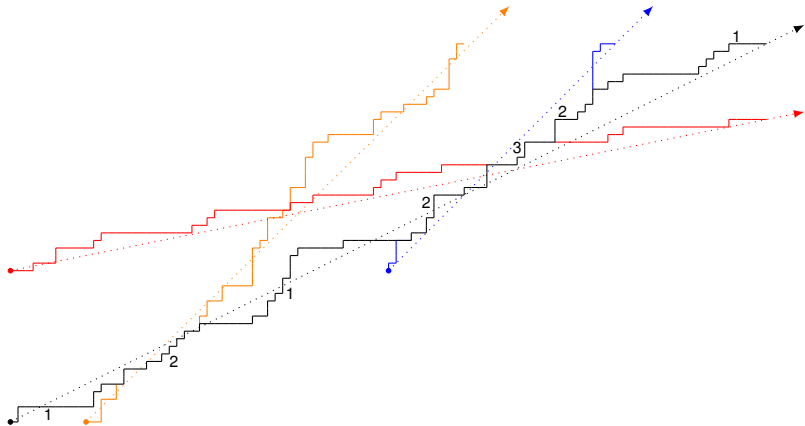
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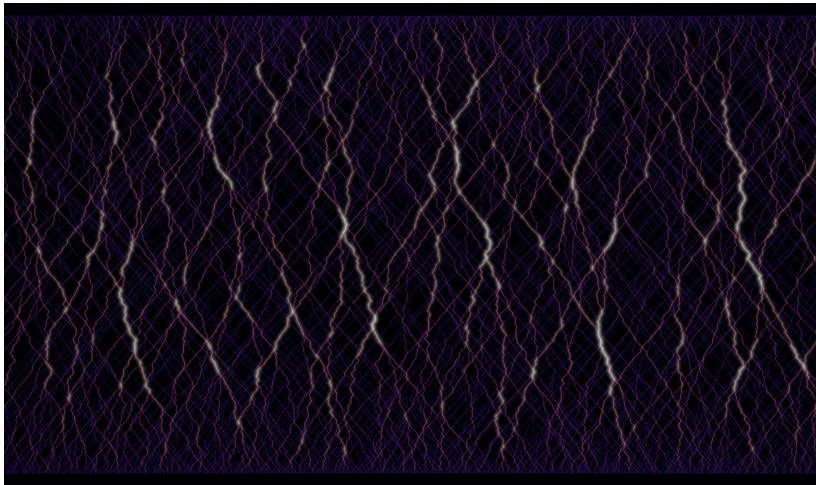
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Simulation by David Harper

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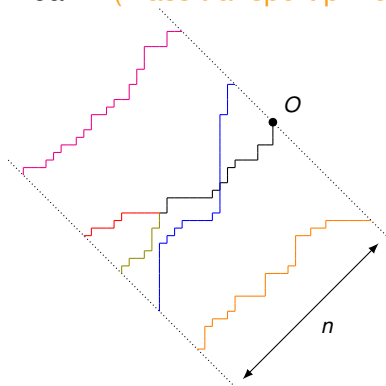
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- ▶ Is this actually a good model of real road networks out there?

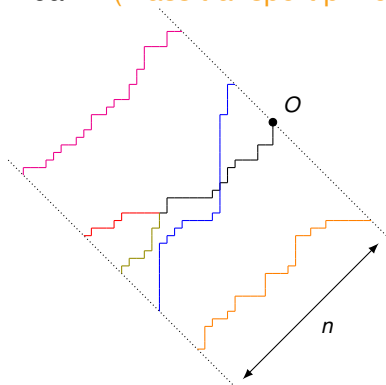
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From all layers: $N = \sum_{n=1}^{\infty} N_n$ is of infinite mean.

Answers

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$$cn^{-1/3} \leq \mathbb{P}\{\text{a car from distance } \geq n \text{ visits } O\} \leq Cn^{-1/3}.$$

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$$\frac{C}{k} \leq \mathbb{P}\{N \geq k^4\} \leq \frac{C \log k}{k}.$$

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$$\mathbb{P}\{\text{road with } \geq k^4 \text{ cars within distance } k\} \sim \mathcal{O}\left(\frac{1}{2}\right).$$

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With similar methods,

Theorem

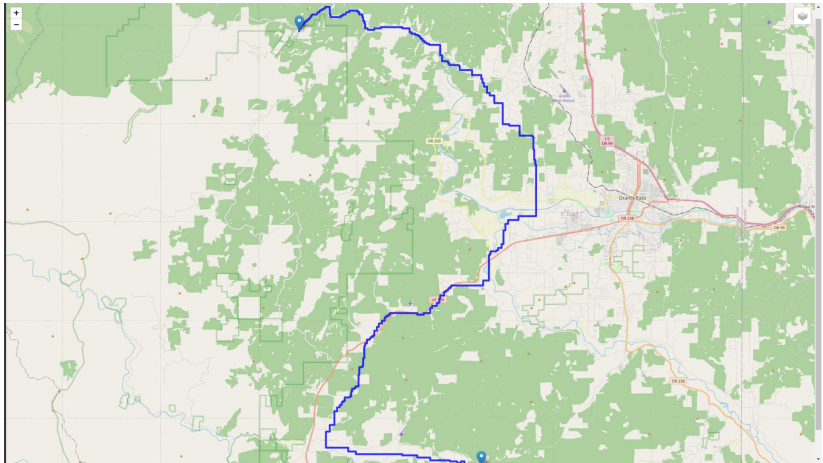
$$\mathbb{P}\left\{\text{no road with } \geq k^4 \text{ cars within distance } \frac{\delta k}{\log k}\right\} \geq 1 - C\delta.$$

We don't believe the log.

Theorem

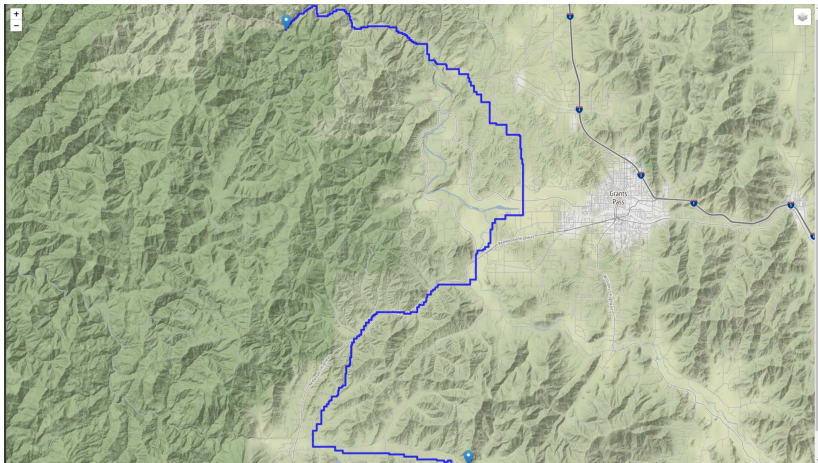
$$\mathbb{P}\{\text{yes, road with } \geq \text{const} \cdot k^4 \text{ cars within distance } k\} \geq c.$$

Is this all any good?



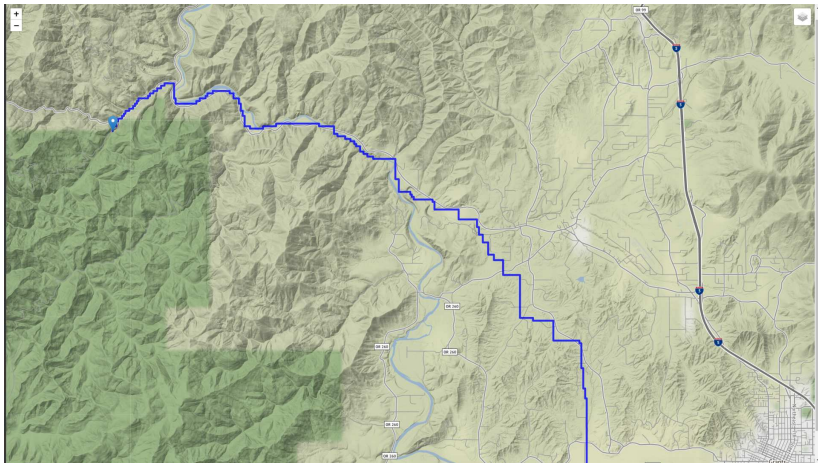
Simulation by David Harper

Is this all any good?



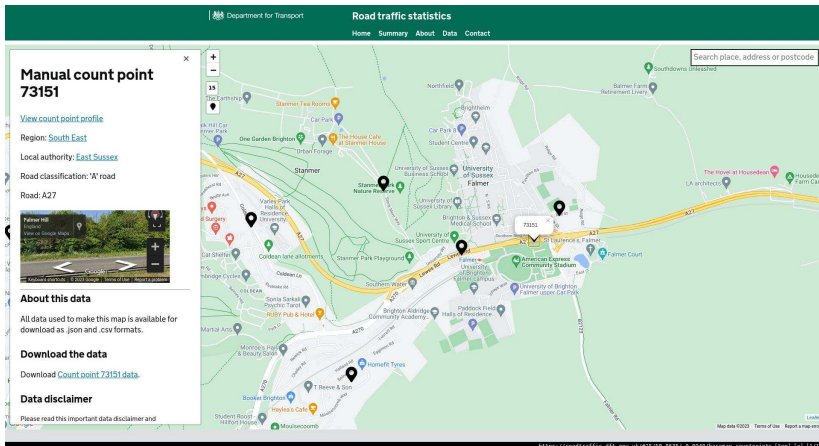
Simulation by David Harper

Is this all any good?



Simulation by David Harper

Is this all any good?



Is this all any good?



$\mathbb{P}\{\text{road with } \geq \ell \text{ cars within distance } k\} \dots ?$

Is this all any good?



$\mathbb{P}\{\text{road with } \geq \ell \text{ cars within distance } k\} \dots ?$

Thank you.