

# Road layout in the KPZ class

Growing out of a project that started with  
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A naive Poisson model

Last passage percolation

Our model

Questions

Answers

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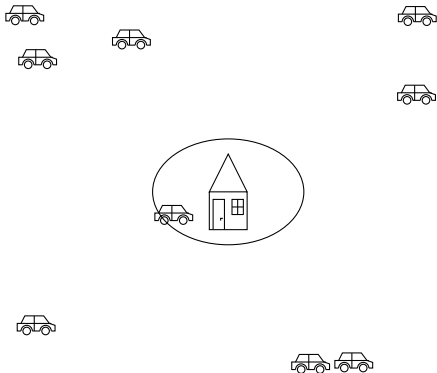
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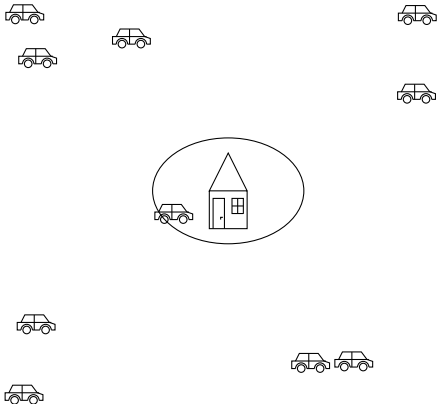
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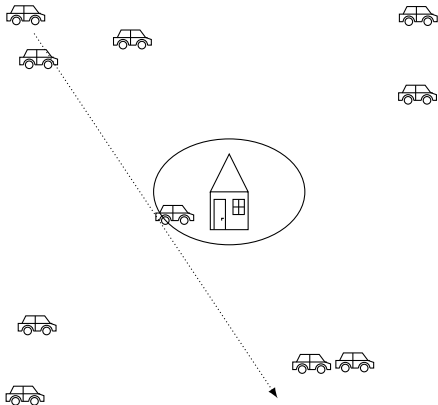
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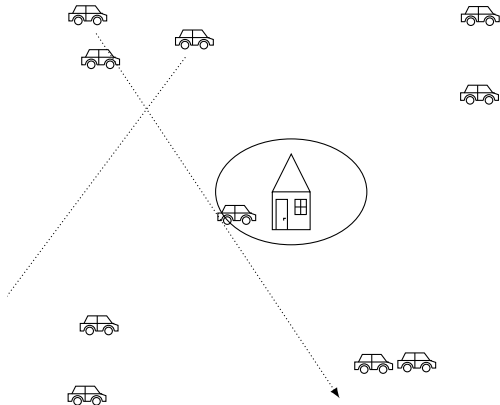
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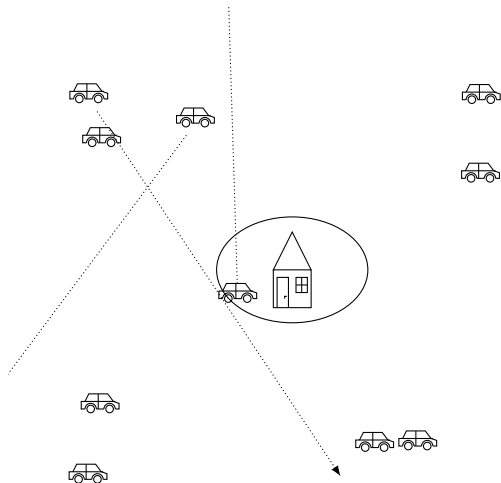
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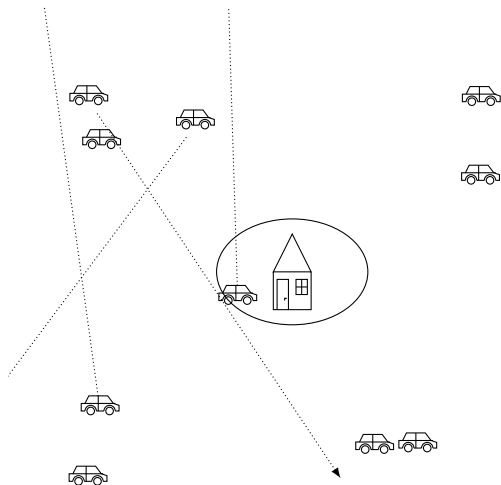


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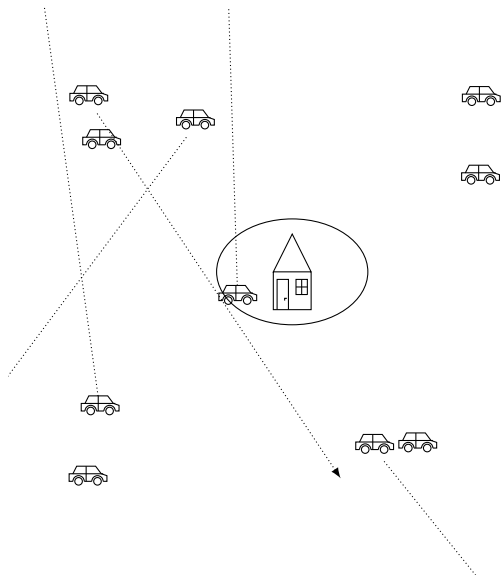




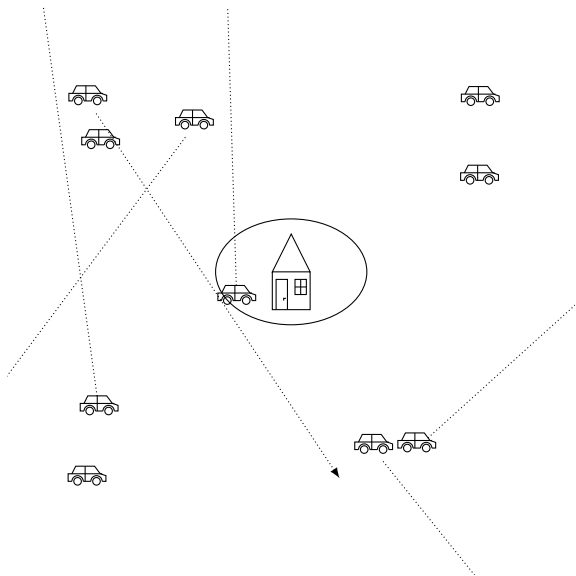
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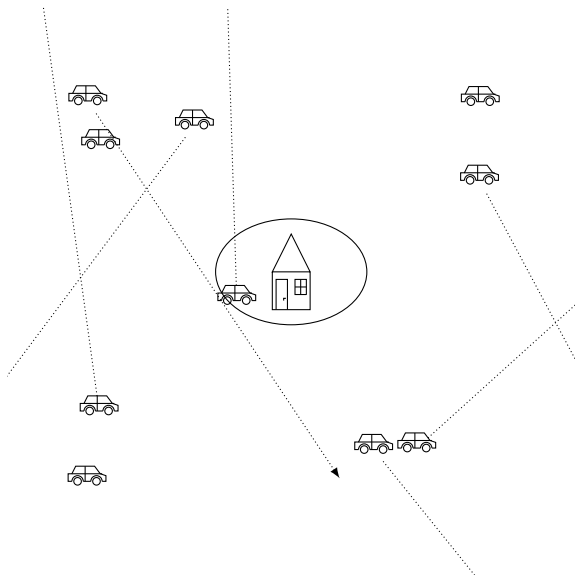
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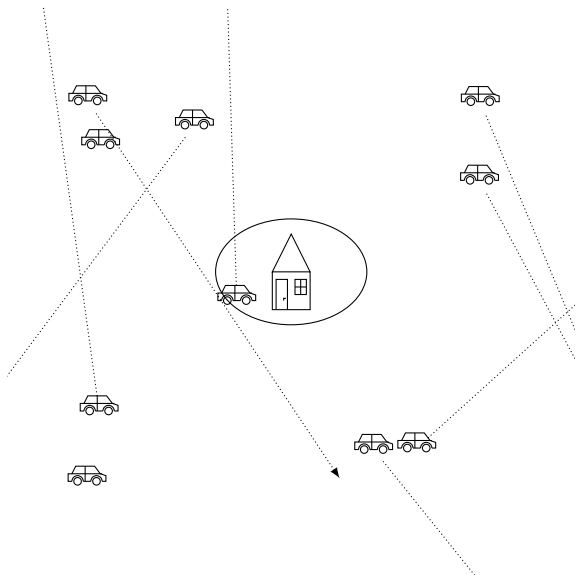
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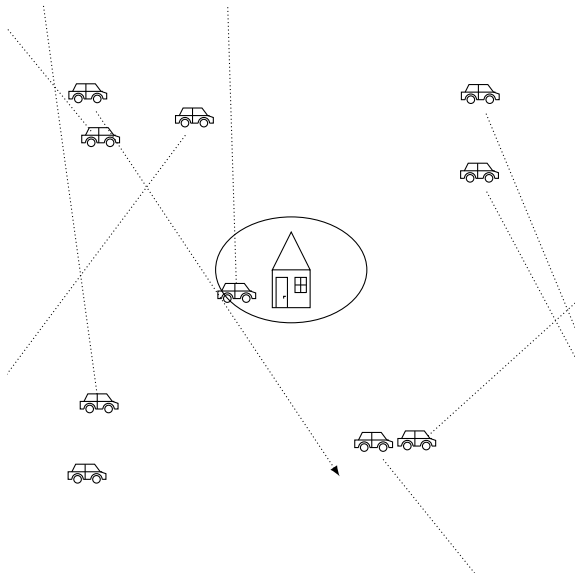
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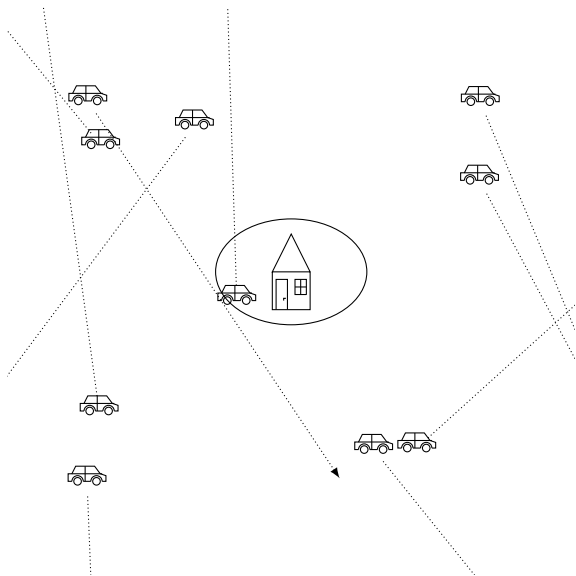
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- ▶ Unfortunately  $D \gg r \dots$



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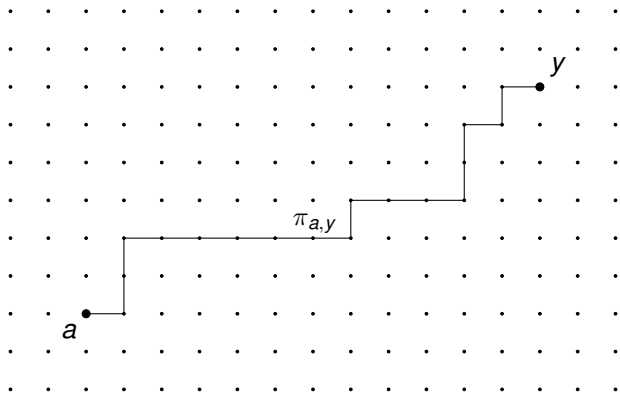
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- ▶ More tools in Exponential last passage percolation (LPP). Should behave similarly to FPP.

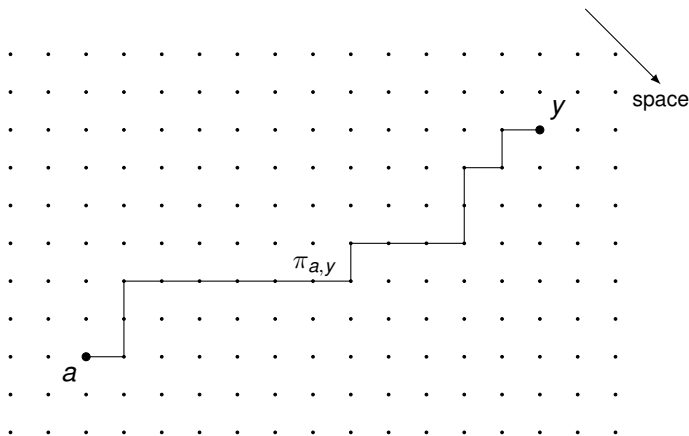
# Last passage percolation

- ▶ Place  $\omega_z$  i.i.d.  $\text{Exp}(1)$  for  $z \in \mathbb{Z}^2$ .
- ▶ The *geodesic*  $\pi_{a,y}$  from  $a$  to  $y$  is the a.s. unique heaviest up-right path from  $a$  to  $y$ . Its weight is  $G_{a,y}$ .



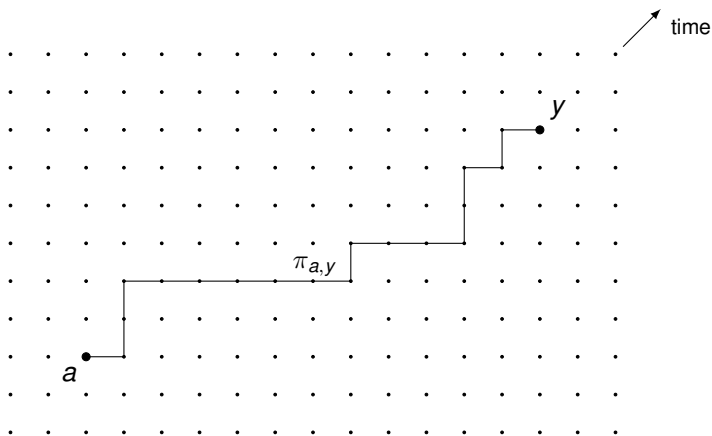
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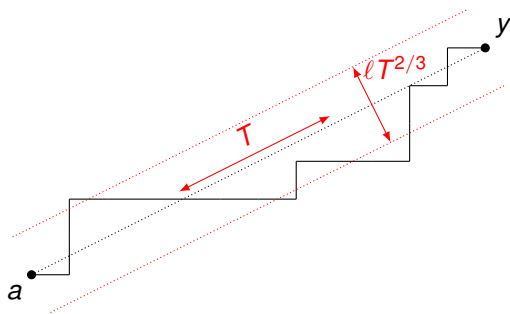


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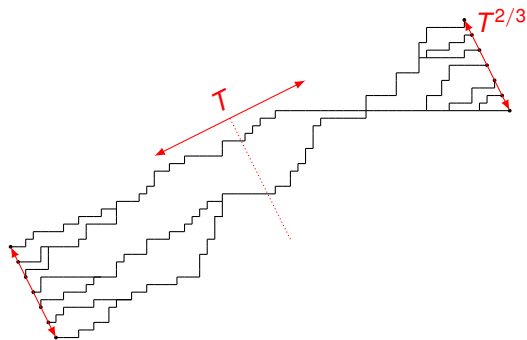
# Last passage percolation: properties



$$\mathbb{P}\{\text{geodesic exits width } lT^{2/3}\} \leq \text{const} \cdot e^{-Cl^3} \quad [\text{Basu, Sarkar, Sly '19}]$$

(KPZ transversal fluctuations).

# Last passage percolation: properties



$\mathbb{P}\{\text{more than } \ell \text{ geodesics at mid-line}\} \leq \text{const} \cdot e^{-C\ell^{1/128}}$

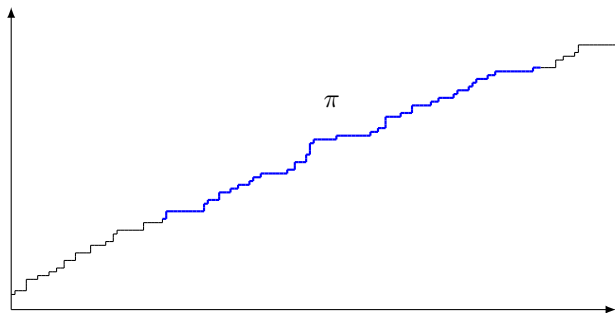
[Basu, Hoffman, Sly '22]

(Midpoint problem).



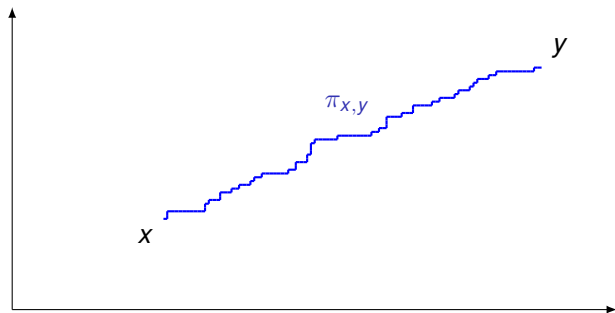
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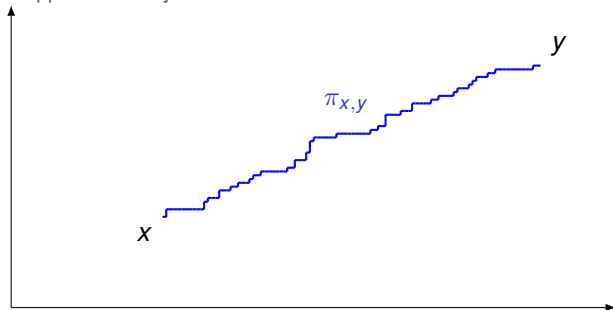
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For any fixed direction this a.s. exists and is unique. [Newman (et al) '96]; [Wüthrich '02]; [Ferrari, Pimentel '05]; [Coupier '11]; [Janjigian, Rassoul-Agha, Seppäläinen '23]



## Our model

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

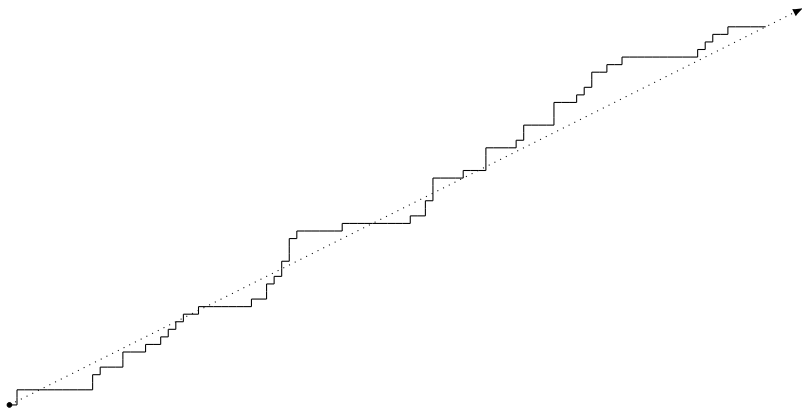
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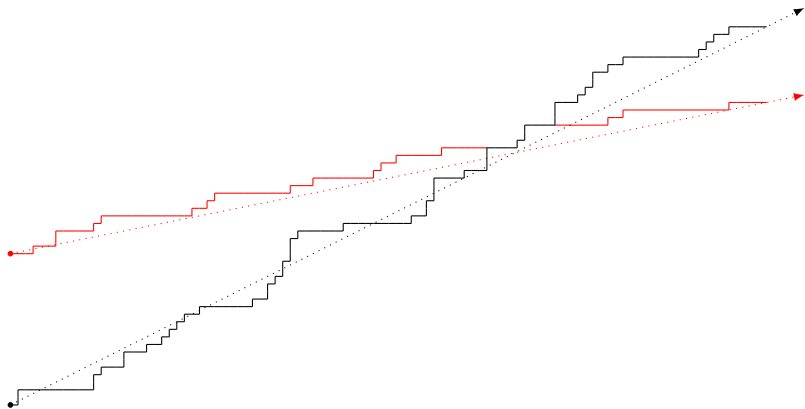
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- ▶ Draw the a.s. semi-infinite geodesic for each point to its chosen direction. Many of these will coalesce when the angles are close. **That's our road map with traffic data on it. A road segment is *busy* when many geodesics use that edge.**

# Our model

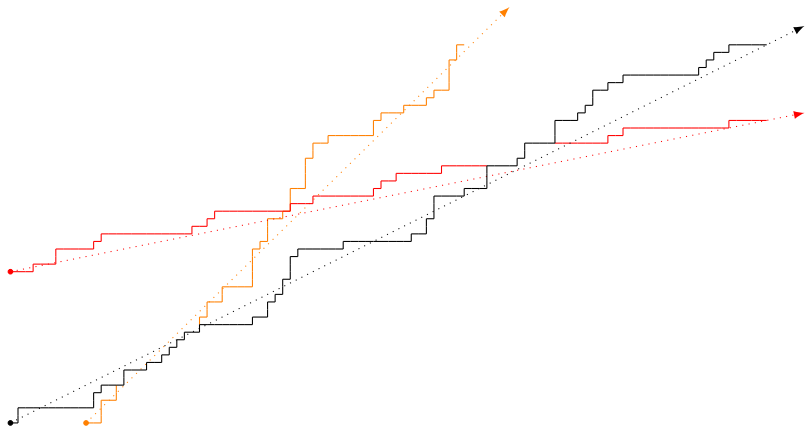


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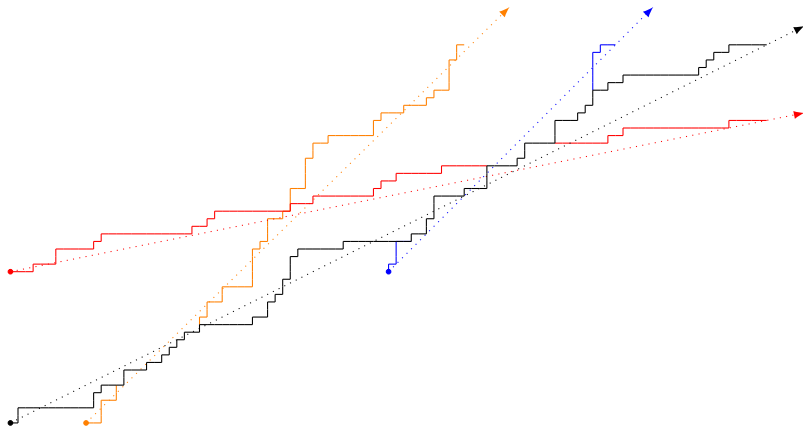




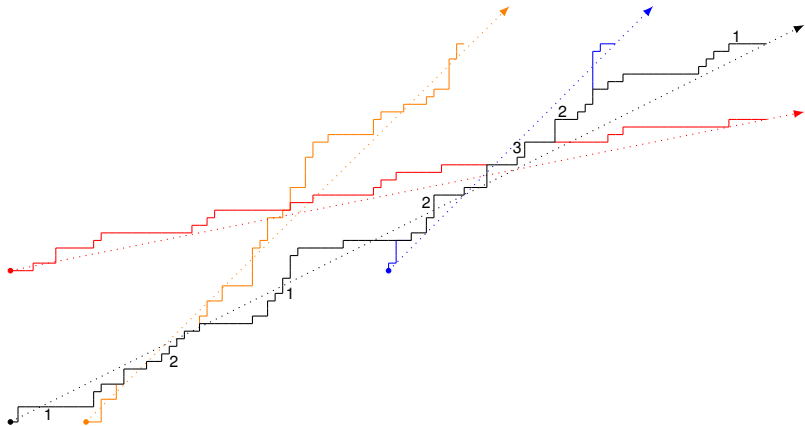
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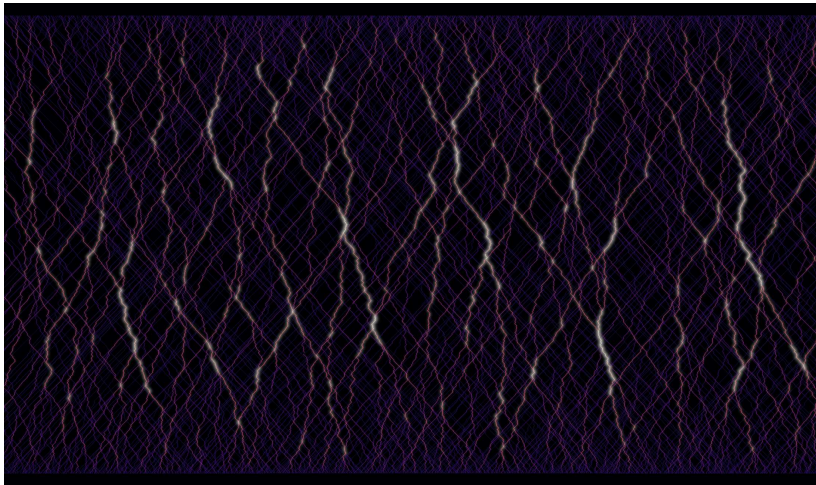
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*Simulation by David Harper*

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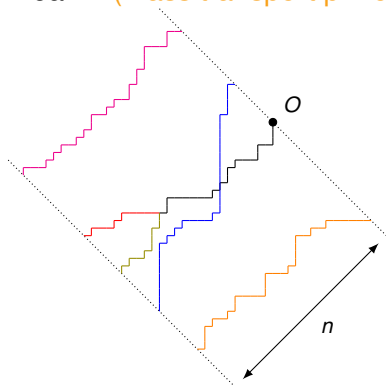
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- ▶ Is this actually a good model of real road networks out there?



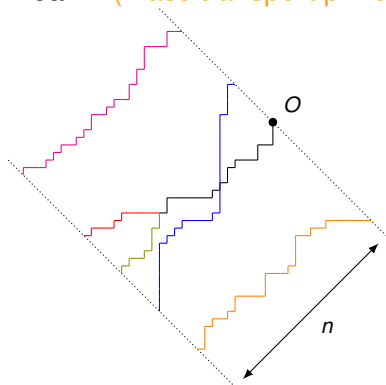
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From all layers:  $N = \sum_{n=1}^{\infty} N_n$  is of infinite mean.

# Answers

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# How many cars go through the origin?

## Theorem

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

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- ▶  $\rightsquigarrow$  lower bound.

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With similar methods,

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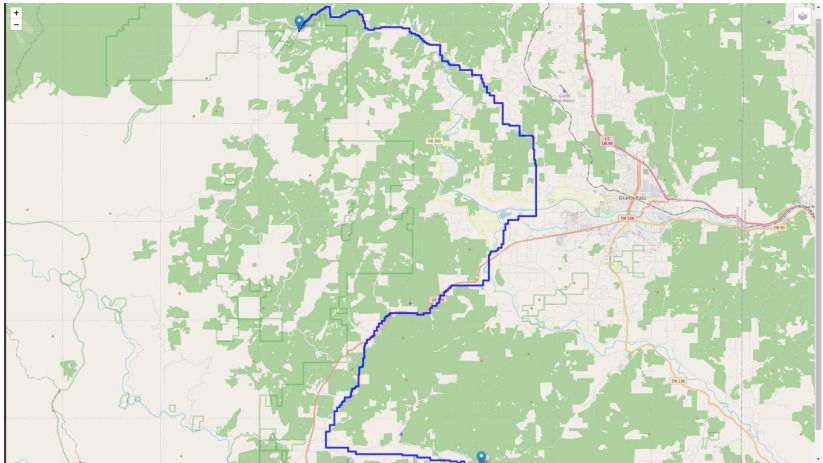
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### Theorem

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

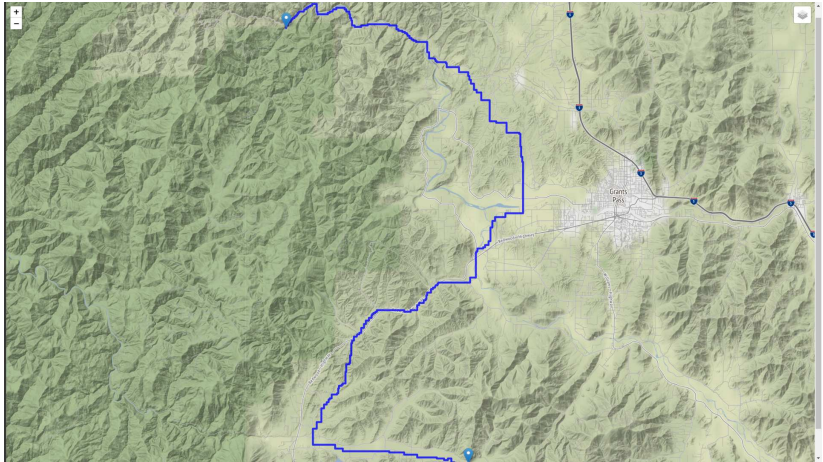
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*Simulation by David Harper*

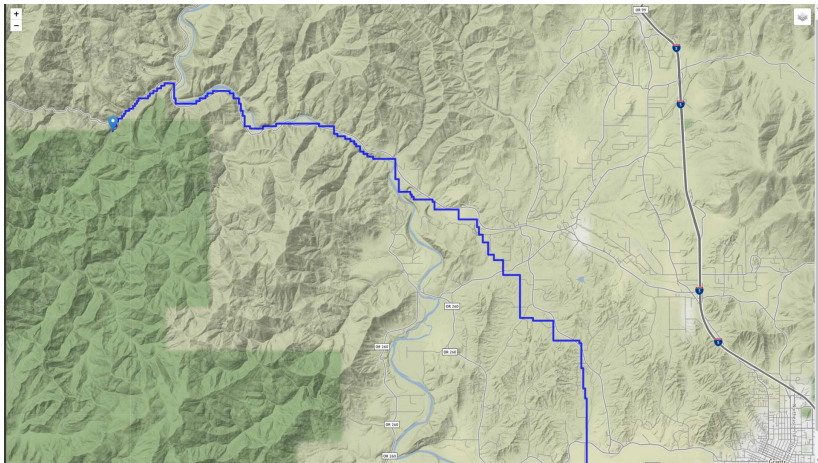


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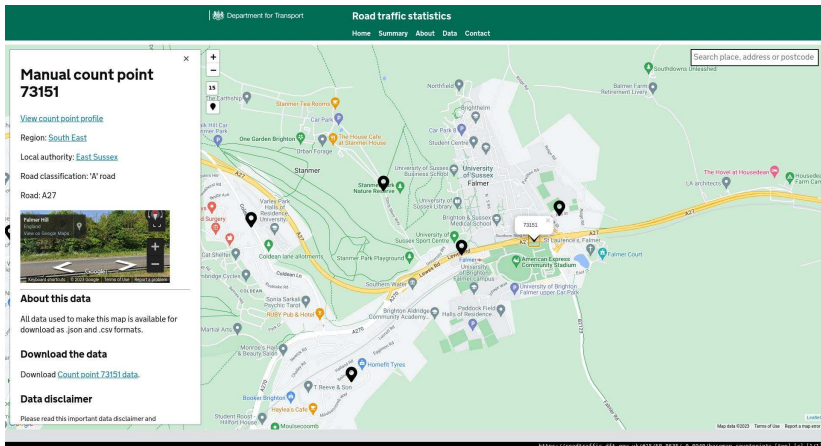
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$\mathbb{P}\{\text{road with } \geq \ell \text{ cars within distance } k\} \dots ?$

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Thank you.