# Modelling train delays

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## Exponential decay law



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### Zipf's law - OE corpus



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# Population distribution



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log(frequency) *vs.* log(population) is a straight line.

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### The q-exponential law

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• large q gives a power-law (long tail)

#### Manchester, all departures



delay/minutes

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#### Manchester to Liverpool



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### Manchester to airport



delay/minutes

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#### Manchester to London Euston



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#### Estimated parameters



How good is it?

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# K M Briggs & C Beck, *Modelling train delays with q-exponential functions* Physica **A 378**, 498–504 (2007).