

# The Asymmetric Exclusion Process: an exactly solvable nonequilibrium system

Martin R. Evans

SUPA, School of Physics and Astronomy, University of Edinburgh, U.K.

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*Collaborators:*

R. A. Blythe, F. Calaori, B. Derrida, F. H. L. Essler, P. A. Ferrari, V Hakim,  
K. Mallick, V. Pasquier, S. Prolhac, A. Proeme, K.E.P. Sugden

# Plan: Asymmetric Exclusion Process

## Plan

- I Definition of model
- II Solution by matrix approach
- III q-deformed generalisations
- IV multi species generalisations

## Review:

R. A. Blythe and M.R.Evans, Nonequilibrium steady states of matrix-product form: a solver's guide, J. Phys. A.: Math. Theor. **40** R333-R441

# I Definition of Totally Asymmetric Exclusion Process

## TASEP

Usually consider 1d lattice of Length  $N$ ,  $\mathbb{Z}_N$

- at most one particle per site (exclusion)
- particles hop forward with rate  $p$  (totally asymmetric hopping)

# I Definition of Totally Asymmetric Exclusion Process

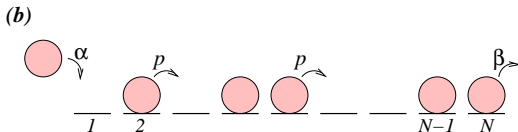
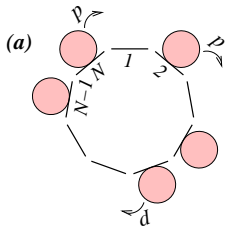
## TASEP

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- at most one particle per site (exclusion)
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Boundary conditions:

- on ring (periodic boundary conditions)
- or on open lattice



# Motivation

- The ASEP was first introduced in 1968 as a model for RNA translation by ribosomes  
(MacDonald, Gibbs and Pipkin, *Biopolymers* 1968)
- Now a general model for traffic (both vehicular and biophysical)
- It is a *nonequilibrium system*, since a current always flows — stationary state not known a priori
- Exhibits phase transitions in 1 dimension  
(Krug, *Phys. Rev. Lett.* 1991)
- Exactly solvable model

# Correlation functions

Use indicator variable  $\tau_i = 1, 0$  for particle, hole respectively

Then

$$\frac{d}{dt} \langle \tau_i \rangle = p \langle \tau_{i-1} (1 - \tau_i) \rangle - p \langle \tau_i (1 - \tau_{i+1}) \rangle$$

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$\langle \tau_i(t) \rangle$  is the **density** at site  $i$  at time  $t$

$J_{i,i+1} = p \langle \tau_i (1 - \tau_{i+1}) \rangle$  is the **current** from site  $i$  to  $i + 1$

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**Hierarchy of correlation functions** e.g.

$$\frac{d}{dt} \langle \tau_i (1 - \tau_{i+1}) \rangle = -p \langle \tau_i (1 - \tau_{i+1}) \rangle + p \langle \tau_{i-1} (1 - \tau_i) (1 - \tau_{i+1}) \rangle + p \langle \tau_i \tau_{i+1} (1 - \tau_{i+2}) \rangle$$

... difficult to solve generally



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... difficult to solve generally

**N. B.** take  $p = 1$  from now on

# II Exact Solution of Stationary State

## Matrix Product Solution for Open Boundaries

$\bullet$   $\rightarrow D$  and  $\_$   $\rightarrow E$  where  $D, E$  are matrices

e.g.  $\text{Prob} \left[ \_ \bullet \_ \bullet \right] = \frac{\langle W | EDED | V \rangle}{Z_4}$

where

$$Z_N = \langle W | C^N | V \rangle \quad C = D + E$$

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### Necessary and Sufficient Conditions

$$D E = D + E$$

$$\beta D | V \rangle = | V \rangle$$

$$\alpha \langle W | E = \langle W |$$

(Derrida, Evans,  
Hakim, Pasquier 1993)

# Form of matrices

Several possible representations are possible, for example :

$$D = \begin{pmatrix} 1 & 1 & 0 & 0 & \cdots \\ 0 & 1 & 1 & 0 & \\ 0 & 0 & 1 & 1 & \\ 0 & 0 & 0 & 1 & \\ \vdots & & & & \ddots \end{pmatrix} \quad E = \begin{pmatrix} 1 & 0 & 0 & 0 & \cdots \\ 1 & 1 & 0 & 0 & \\ 0 & 1 & 1 & 0 & \\ 0 & 0 & 1 & 1 & \\ \vdots & & & & \ddots \end{pmatrix}$$

$$\langle W| = \kappa ( 1, \quad a, \quad a^2 \quad . \quad . ) \quad |V\rangle = \kappa \begin{pmatrix} 1 \\ b \\ b^2 \\ \vdots \\ \vdots \end{pmatrix},$$

where  $a = \frac{1-\alpha}{\alpha}$      $b = \frac{1-\beta}{\beta}$  and  $\kappa^2 = (\alpha + \beta - 1)/\alpha\beta$

- matrices **generally (semi) infinite** except along  $\alpha + \beta = 1$
- calculation of matrix product elements corresponds to enumeration of lattice paths

# Exact Solution of Stationary State

## Calculation of the Current

$$\begin{aligned} J_N &= \alpha \langle (1 - \tau_1) \rangle = \langle \tau_i (1 - \tau_{i+1}) \rangle = \beta \langle \tau_N \rangle \\ &= \alpha \frac{\langle W | EC^{N-1} | V \rangle}{Z_N} = \frac{\langle W | C^{i-1} DEC^{N-i-1} | V \rangle}{Z_N} = \beta \frac{\langle W | C^{N-1} D | V \rangle}{Z_N} \\ &= \frac{Z_{N-1}}{Z_N} \quad \text{ratio of nonequilibrium partition functions} \end{aligned}$$

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## Calculation of the $Z_N$

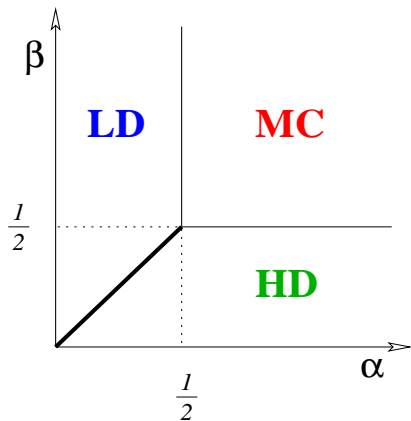
$$C^0 = 1, \quad C^1 = D + E, \quad C^2 = D^2 + E^2 + ED + D + E, \quad \dots$$

$$C^N = \sum_{n,m} a_{n,m} E^n D^m \quad \langle W | C^N | V \rangle = \sum_{n,m} a_{n,m} \frac{1}{\alpha^n} \frac{1}{\beta^m}$$

for large  $N$ ,  $\langle W | C^N | V \rangle \sim c^N N^{-\lambda}$  so

$$J \rightarrow \frac{1}{c}$$

# Stationary Phase Diagram



**HD** - high density phase controlled by right boundary

$$\rho = \beta, J = \beta(1 - \beta)$$

**LD** - low density phase controlled by left boundary

$$\rho = \alpha, J = \alpha(1 - \alpha)$$

**MC** - maximal current phase  $\rho = 1/2, J = 1/4$

# First-order line and domain wall dynamics

$\alpha = \beta < 1/2$  is first-order transition line

Along first-order line stationary state is superposition of **shocks**

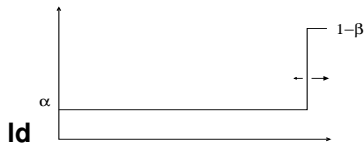


(domain walls)

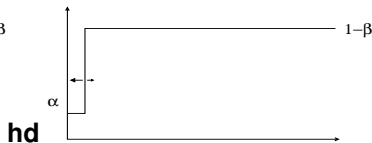
which generates an **exact** linear average profile.

Extending this picture to regime HD I/ LD I gives an *effective* description of dynamics in terms of domain walls moving

stochastically with bias velocity  $v_s = \frac{\beta(1-\beta) - \alpha(1-\alpha)}{1-\beta-\alpha} = \beta - \alpha$



(Dudzinsky, Schütz 2000)

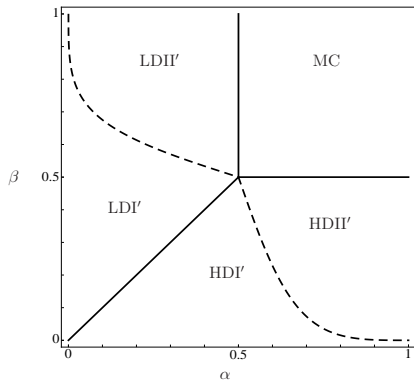




# Dynamical Phase Diagram - de Gier-Essler Line

## Dynamical Phase Diagram

(de Gier and Essler 2005)

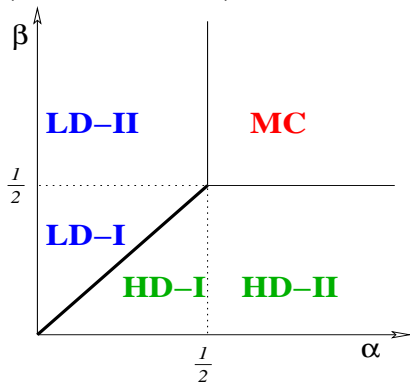


Explanation?

## Stationary Phase Diagram

(Derrida, Evans, Hakim, Pasquier 1993),

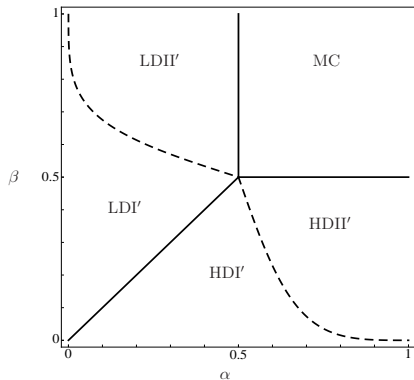
(Schütz, Domany 1993)



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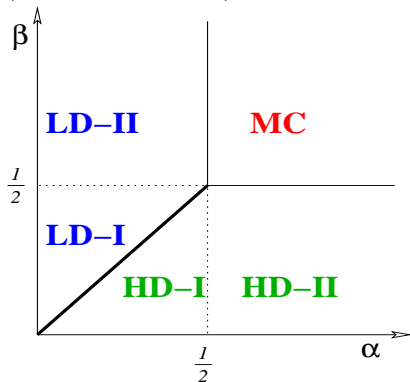
## Dynamical Phase Diagram

(de Gier and Essler 2005)



## Stationary Phase Diagram

(Derrida, Evans, Hakim, Pasquier 1993),  
(Schütz, Domany 1993)



Explanation? **It's a mystery!**

but deGE line does exist (Proeme, Blythe, Evans 2011)

# Stationary Phase Diagram: Lee Yang Theory

- Consider normalisation as a **nonequilibrium partition function**

$$Z_N = \sum_{p=1}^N \frac{p!(2N-1-p)!}{N!(N-p)!} \frac{(1/\beta)^{p+1} - (1/\alpha)^{p+1}}{(1/\beta) - (1/\alpha)}$$

- Generalise real rates  $\alpha, \beta$  to complex parameters and consider zeros of  $Z_N$  in e.g. the complex  $\alpha$  plane
- Phase transitions occur when complex zeros of  $Z_N$  'pinch' the real axis as  $N \rightarrow \infty$

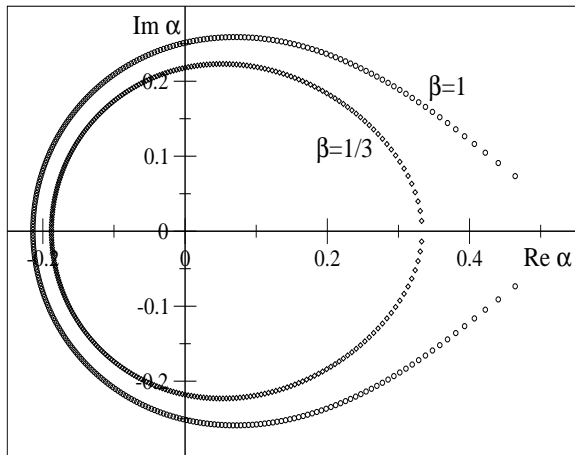
**first order line:** finite density of zeros pinch at angle  $\pi/2$

**second order line:** vanishing density of zeros pinch at angle  $\pi/4$

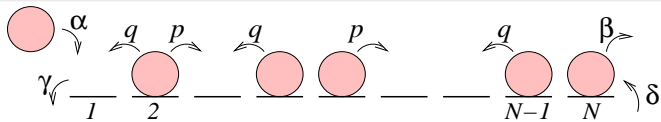
- $\lim_{N \rightarrow \infty} \frac{1}{N} \ln Z_N = \ln J$  so **current plays role of free energy**

# Stationary Phase Diagram: Lee Yang Theory

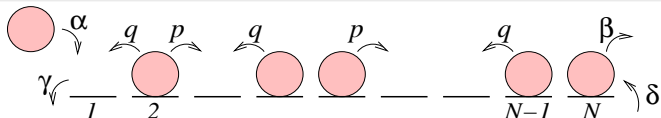
Zeros of  $Z_N(\alpha, \beta)$  in complex alpha plane



## II Partial Asymmetry



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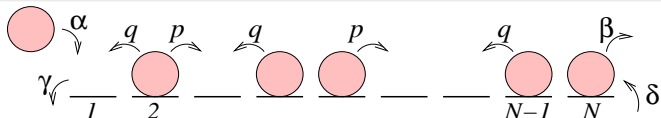
quadratic algebra

$$DE - qED = D + E$$

$$(\beta D - \delta E)|V\rangle = |V\rangle$$

$$\langle W|(\alpha E - \gamma D) = \langle W|$$

# II Partial Asymmetry



quadratic algebra

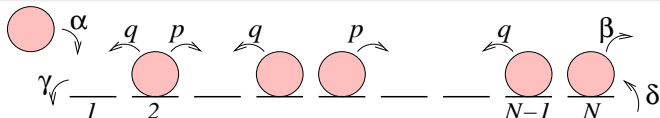
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$$\text{Let } D = \frac{1}{1-q} + \frac{\hat{a}}{(1-q)^{1/2}} \quad E = \frac{1}{1-q} + \frac{\hat{a}^\dagger}{(1-q)^{1/2}}$$

# II Partial Asymmetry



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$\Rightarrow$

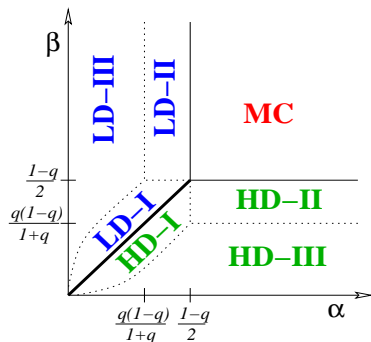
$$\hat{a}\hat{a}^\dagger - q\hat{a}^\dagger\hat{a} = 1$$

q-deformed harmonic oscillator



# III Partial Asymmetry: Results for $\gamma = \delta = 0$

- $q < 1$  (forward bias)



Sasamoto 2000

- $q > 1$  (reverse bias)

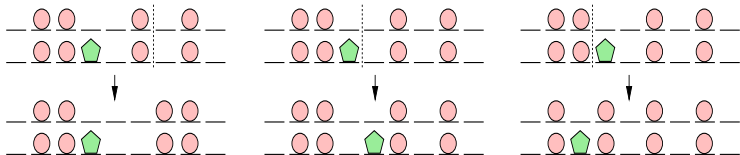
$$J \simeq \left( \frac{\alpha\beta(q-1)^2}{(q-1+\alpha)(q-1+\beta)} \right)^{1/2} q^{-N/2+1/4}$$

Blythe, Evans, Calaori, Essler 2000

- $q = 1$  (symmetric) linear profile and  $J \simeq \frac{1}{N}$

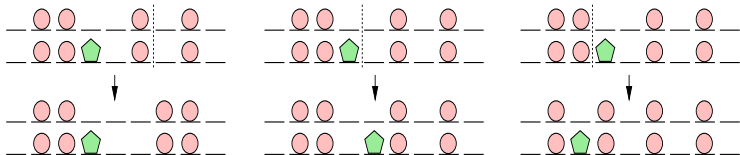
# IV Many Species: 2 species ASEP

- Motion of an **excess** particle



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- **Second class** particle dynamics

$$10 \rightarrow 01$$

$$20 \rightarrow 02$$

$$12 \rightarrow 21$$

- Second class particle moves forward in low density environment, moves backward in high density environment. It therefore **tracks** ‘**shocks**’ (discontinuities in density profile)

## 2-ASEP: Matrix Solution on Ring

$\tau_i = 0, 1, 2$ , let there be  $P_1$  first class,  $P_2$  second class and  $P_0 = N - P_1 - P_2$  holes

Stationary measure Derrida, Janowsky, Lebowtiz and Speer 1993

$$\text{Prob}(\{\tau_i\}) = \frac{\text{Tr} \left[ \prod_{i=1}^N X_{\tau_i} \right]}{Z(P_0, P_1, P_2)}$$

matrices now  $X_0 = E$ ,  $X_1 = D$ ,  $X_2 = A$

### Quadratic algebra

$$DE = D + E$$

$$DA = A$$

$$AE = A$$

Where

$$A = |0\rangle\langle 0|$$

is a projector

# Multispecies TASEP

## Multispecies TASEP: ' $n$ -TASEP'

$n$  Classes of particle and vacancies

$$K 0 \rightarrow 0 K \quad \text{for} \quad n \geq K \geq 1$$

$$K J \rightarrow J K \quad \text{for} \quad n \geq J > K \geq 1$$

e.g.  $n=3$

$$1 0 \rightarrow 0 1$$

$$2 0 \rightarrow 0 2$$

$$3 0 \rightarrow 0 3$$

$$1 2 \rightarrow 2 1$$

$$1 3 \rightarrow 3 1$$

$$2 3 \rightarrow 3 2$$

# Matrix Solution for 3-TASEP

$$X_1 = \mathbf{1} \otimes \mathbf{1} \otimes D + \delta \otimes \epsilon \otimes A + \delta \otimes \mathbf{1} \otimes E$$

$$X_2 = A \otimes \mathbf{1} \otimes A + A \otimes \delta \otimes E$$

$$X_3 = A \otimes A \otimes E$$

$$X_0 = \mathbf{1} \otimes \mathbf{1} \otimes E + \mathbf{1} \otimes \epsilon \otimes A + \epsilon \otimes \mathbf{1} \otimes D$$

where

$$\delta = D - \mathbf{1} \quad \epsilon = E - \mathbf{1}$$

## Example of algebraic conditions

$$X_1 X_2 = X_2 \hat{X}_1 - \hat{X}_2 X_1$$

$$-X_1 X_2 = X_1 \hat{X}_2 - \hat{X}_1 X_2$$

Example of hat matrix:  $\hat{X}_1 = (\mathbf{1} - \delta) \otimes \mathbf{1} \otimes \mathbf{1}$

# Hierarchical Solution for $n$ -TASEP

**Hierarchical Solution for  $n$ -TASEP** Evans, Ferrari, Mallick 2009

$$X_K^{(n)} = \sum_{M=0}^{n-1} a_{KM}^{(n)} \otimes X_M^{(n-1)} \text{ for } 1 \leq K \leq n.$$

$$X_0^{(n)} = -X_0^{(n)} + \sum_{M=0}^{n-1} a_{0M}^{(n)} \otimes X_M^{(n-1)}$$

$X_K^{(n)}$ : the lower index  $K$  denotes the class of the particle; the upper index  $n$  gives the number of classes in the system.

$a_{JM}^{(n)}$  themselves tensor products of fundamental matrices  $A, D, E, 1$

## Algebraic Conditions

$$[X_J^{(n)}, \hat{X}_J^{(n)}] = 0 \quad 0 \leq J \leq n$$

$$\begin{aligned} X_J^{(n)} X_K^{(n)} &= \hat{X}_J^{(n)} X_K^{(n)} - X_J^{(n)} \hat{X}_K^{(n)} & J < K \\ &= \hat{X}_K^{(n)} X_J^{(n)} - X_K^{(n)} \hat{X}_J^{(n)} & \text{or } K = 0 \end{aligned}$$

## Structure of 'Matrices'

$\dim(n)$  = no. fundamental matrices  $D, E, \mathbf{1}$  in tensor product =  $\binom{n}{2}$

$n$     $\dim(n)$

1	0	scalars
2	1	matrices
3	3	

**What is the interpretation?**



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$n$     $\dim(n)$

1     0     scalars

2     1     matrices

3     3

### What is the interpretation?

no. queue counters required for  $n - 1$  priority queue system =

$$\sum_{i=1}^{n-1} i = \binom{n}{2} = \dim(n)$$

# Queueing Interpretation: 2- TASEP

Recall

$$D = \sum_{n=0} |n\rangle [\langle n| + \langle n+1|] \quad E = \sum_{n=0} [|n\rangle + |n-1\rangle] \langle n| \quad A = |0\rangle \langle 0|$$

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Think of  $|n\rangle$  as state of a queue (no. customers waiting).

$t(i) = N - i$  is discrete time

$$\begin{aligned} \tau_i &= 0 && \text{no service} \\ \tau_i &= 1 && \text{used service} \\ \tau_i &= 2 && \text{unused service} \end{aligned}$$

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$$\tau_i = 0 \quad \text{no service}$$

$$\tau_i = 1 \quad \text{used service}$$

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Weight of config.  $\{\tau_i\}$  = no. queue trajectories consistent with  $\{\tau_i\}$

$$\tau_i = 0 \quad E|n\rangle = \quad |n\rangle + |n+1\rangle$$

no arrival    new arrival

$$\tau_i = 1 \quad D|n\rangle = \quad |n-1\rangle + |n\rangle$$

$$\tau_i = 2 \quad A|n\rangle = \quad |0\rangle \delta_{n,0} \quad \text{queue must be empty}$$

# Queueing Interpretation: 3- TASEP

Now think of 2 **tandem queues**:

q1 contains **first class customers** which get served and go to q2

q2 contains **first class customers** arriving from q1 and **second class customers** arriving from outside

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$q_2$  contains **first class customers** arriving from  $q_1$  and **second class customers** arriving from outside

**State of queues** is  $|l\rangle|m\rangle|n\rangle$

where  $l$  is no. first class in  $q_2$ ,  $m$  is no. second class in  $q_2$ ,

$n$  is no. first class in  $q_1$

$\tau_i = 0$       no service in  $q_2$

$\tau_i = 1$       first class service in  $q_2$

$\tau_i = 2$       second class service in  $q_2$

$\tau_i = 3$       unused service in  $q_2$

# Queueing Interpretation: 3- TASEP

Now think of 2 **tandem queues**:

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**State of queues** is  $|l\rangle|m\rangle|n\rangle$

where  $l$  is no. first class in **q2**,  $m$  is no. second class in **q2**,  
 $n$  is no. first class in **q1**

$\tau_i = 0$  no service in **q2**

$\tau_i = 1$  first class service in **q2**

$\tau_i = 2$  second class service in **q2**

$\tau_i = 3$  unused service in **q2**

e.g.  $\tau_i = 3$  unused service in **q2**  $\Rightarrow l = m = 0$ ;  
possible arrival at **q1**  $\Rightarrow n \rightarrow n$  or  $n \rightarrow n + 1$

$$X_3 |l\rangle|m\rangle|n\rangle = \delta_{l,0} |l\rangle \delta_{m,0} |m\rangle [|n\rangle + |n+1\rangle] = A|l\rangle A|m\rangle E|n\rangle$$

# Conclusions

- A fundamental class of nonequilibrium stationary states may be solved exactly as a matrix product.
- Algebraic proof of stationary measure requires **quadratic algebras and generalisations**
- Construct stationary measure hierarchically from  $(n-1)$ -TASEP stationary measure
- The 'Matrices' act on space of queue counters



# What I've left out

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- Simple mean field theory correctly predicts phase diagram and is first recourse for many systems
- Biophysical systems imply generalisations to dynamically extending 1d lattices and coupled one lattices
- Current fluctuations and large deviations

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- ... **and much, much more**