

# MAS275 Probability Modelling Example 21: Monopoly

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Each player has a token which moves round the board in a circuit. On each turn the initial movement is determined by moving two dice.

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One corner (square 10) is labelled “Jail” and the opposite corner (square 30) “Go to Jail”.

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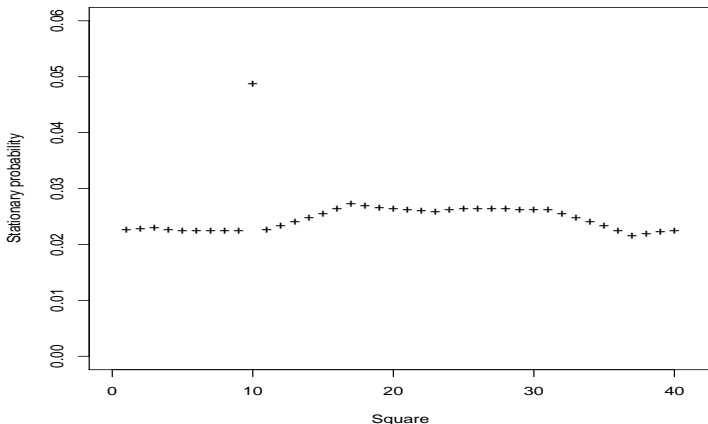
If the player lands on square 30 ("Go to Jail") the token moves to square 10 ("Jail"). So we set  $p_{30,10} = 1$  (and  $p_{30,i} = 0$  for  $i \neq 10$ ).

# First stationary distribution

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Jail high probability; squares between about 15 and 31 (including orange, red, yellow sets) have higher probabilities than others.

# Adding Chance and Community Chest

(Based on US edition circa 1983)



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Then  $p_{7,i}$  is  $\frac{6}{16}d_{i-7}$  plus the probability of being sent to  $i$  by the Chance card, which is  $1/16$  for squares 0 (Go), 4 (back 3 spaces), 5, 10 (Jail), 11, 12 (nearest utility, Electric Company), 24 and 39, and  $1/8$  for square 15 (nearest railway, because there are two of these cards).

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Similar changes to rows 22 and 36

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Landing on squares 2, 17 and 33 gives “Community Chest”.  
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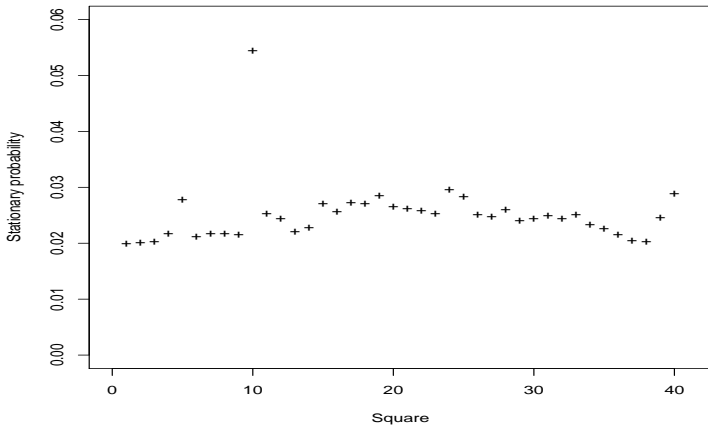
Then  $p_{2,i}$  is  $\frac{14}{16}d_{i-2}$  plus the probability of being sent to  $i$  by the Chance card, which is  $1/16$  for squares 0 (Go) and 10 (Jail). Similar changes to rows 17 and 33.

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Properties on the side of the board after Go (squares 1-9) have relatively low probabilities, except square 5, which is a railway and benefits from Chance cards sending tokens there.

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Chance and Community Chest cards are used in order, not shuffled. (This is non-Markov.)