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- Note that the expected payout is a weighted average of payouts


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- A best response to a strategy will consist of pure strategies that have the same (high) expected payout


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- Note that pure Nash equilibria are still Nash equilibria


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- Test this: what is the payoff of a pure strategy against $\left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}\right)$ ?
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- Note that the expected payoff for each player is 0 (the game is fair)


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Theorem (Nash)
Suppose that:

- a game has finitely many players
- each player has finitely many pure strategies
- we allow for mixed strategies

Then the game admits a Nash equilibrium

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- Strategies in Nash equilibrium are (.7,.3) $(p=.7)$ and $(.6, .4)(q=.6)$


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- Will those with the mutation thrive or die?


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- Percent of population with mutation will grow until Nash equilibrium is reached

