

18.600: Lecture 35

Martingales and risk neutral probability

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Outline

Martingales and stopping times

Martingales and Bayesian expectation revisions

Risk neutral probability and martingales

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Martingales and Bayesian expectation revisions

Risk neutral probability and martingales

Recall martingale definition

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- ▶ “Given all I know today, expected price tomorrow is the price today.”

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- ▶ Think of T as giving the time the asset will be sold if the price sequence is X_0, X_1, X_2, \dots
- ▶ Say that T is a **stopping time** if the event that $T = n$ depends only on the values X_i for $i \leq n$. In other words, the decision to sell at time n depends only on prices up to time n , not on (as yet unknown) future prices.

Examples

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- ▶ What is the probability that it goes down to 45 then up to 55 then down to 45 then up to 55 again — all before reaching either 0 or 100?

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- ▶ This means that the three-element sequence $E[X], E[X|Y], X$ is a martingale.
- ▶ More generally, $E[X|\mathcal{F}_0], E[X|\mathcal{F}_1], E[X|\mathcal{F}_2], \dots$ is a martingale,

Martingales as sequentially updated probability estimates

- ▶ Example: let C be the amount of oil available for drilling under a particular piece of land. Suppose that ten geological tests are done that will ultimately determine the value of C . Let C_n be the **conditional expectation** of C *given* the outcome of the first n of these tests. Then the sequence $C_0, C_1, C_2, \dots, C_{10} = C$ is a martingale.

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- ▶ As long as A_i is defined from my probability measure, it will be a martingale w.r.t. to my probability measure.
- ▶ This is *not* a statement about how well informed my probability measure is.

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- ▶ But there are some caveats: interest, risk premium, etc.
- ▶ According to the **fundamental theorem of asset pricing**, the discounted price $\frac{X(n)}{A(n)}$, where A is a risk-free asset, is a martingale with respect to **risk neutral probability**.

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- ▶ If the answer is .75 dollars, then we say that the risk neutral probability that the shot will be made is .75.
- ▶ Risk neutral probability is the probability determined by the market betting odds.

Risk neutral probability of outcomes known at fixed time T

- ▶ **Risk neutral probability of event A :** $P_{RN}(A)$ denotes

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- ▶ Assuming no **arbitrage** (i.e., no risk free profit with zero upfront investment), P_{RN} satisfies axioms of probability. That is, $0 \leq P_{RN}(A) \leq 1$, and $P_{RN}(S) = 1$, and if events A_j are disjoint then $P_{RN}(A_1 \cup A_2 \cup \dots) = P_{RN}(A_1) + P_{RN}(A_2) + \dots$.

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- ▶ **Arbitrage example:** if A and B are disjoint and $P_{RN}(A \cup B) < P(A) + P(B)$ then we sell contracts paying 1 if A occurs and 1 if B occurs, buy contract paying 1 if $A \cup B$ occurs, pocket difference.

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- ▶ Now, suppose there are only 2 outcomes: A is event that economy booms and everyone prospers and B is event that economy sags and everyone is needy. Suppose purchasing power of dollar is the same in both scenarios. If people think A has a .5 chance to occur, do we expect $P_{RN}(A) > .5$ or $P_{RN}(A) < .5$?

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- ▶ Answer: $P_{RN}(A) < .5$. People are risk averse. In second scenario they need the money more.

Non-systemic event

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- ▶ Even if some people bet based on loyalty, emotion, insurance against personal financial exposure to team's prospects, etc., there will arguably be enough in-it-for-the-money statistical arbitrageurs to keep price near a reasonable guess of what well-informed experts would consider the true probability.

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- ▶ For simplicity, we focus on fixed time T , fixed interest rate r in this lecture.

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- ▶ Pundit: The market predictions are ridiculous. I can estimate probabilities much better than they can.
- ▶ Listener: Then why not make some bets and get rich? If your estimates are so much better, law of large numbers says you'll surely come out way ahead eventually.

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- ▶ Implies **fundamental theorem of asset pricing**, which says discounted price $\frac{X(n)}{A(n)}$ (where A is a risk-free asset) is a martingale with respect to **risk neutral probability**.