



## Acquisition Research Program: Creating Synergy for Informed Change

# When More is Better-Design Principles for Prediction Markets in Defense Acquisition Cost Forecasting

Dr. Ricardo Valerdi, MIT

Dr. Matthew Potoski, Iowa State University

Taroon Aggarwal, MIT

# Acknowledgements

---

- Research supported by the Acquisition Research Program in the Graduate School of Business and Public Policy, Naval Postgraduate School.
- Special thanks to MITRE for extending their support and time, and for providing some useful information on prediction markets.
- We wish to thank Adam Siegel of Inkling Markets for his suggestions on prediction market design.



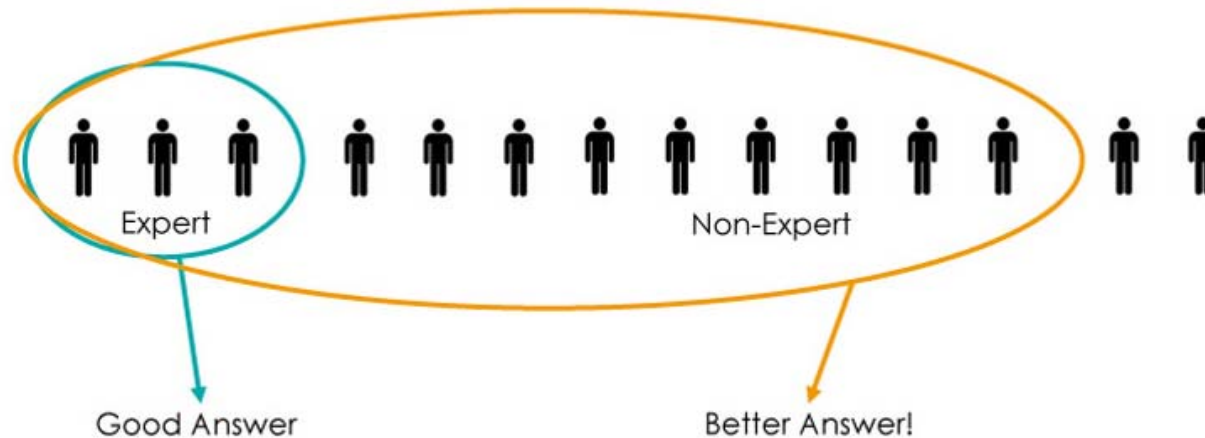
# Prediction Markets: History & Purpose

Prediction markets are speculative markets for predicting outcome of uncertain future event. E.g.: Presidential elections or Printer sales.

Buy and Sell contracts for future event

Incentivizes participants to gather and reveal information

Provide dynamic reflection of wisdom of group as a whole



<http://www.crowdclarity.com/learnmore.htm>



# Prediction Markets: Value Proposition

## Probable limitations of existing cost methods

**Technical factors** rather than “soft” factors

**Not dynamically updated** as the program evolves

**Few decision makers** under time pressure or **biased**

## Possible value propositions of Prediction Markets

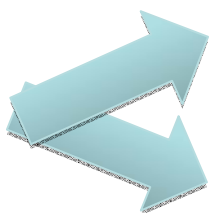
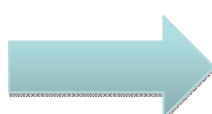
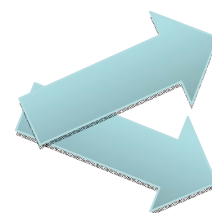
Information leveraged from **diverse sources**

**Incentivize Traders**

**Frequent sampling** of information

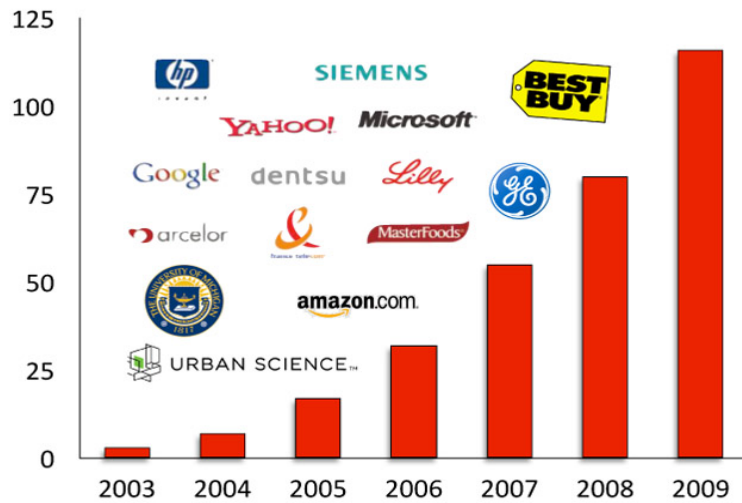
**Mitigation of biases**

Shift of focus from estimating by **individuals to groups**

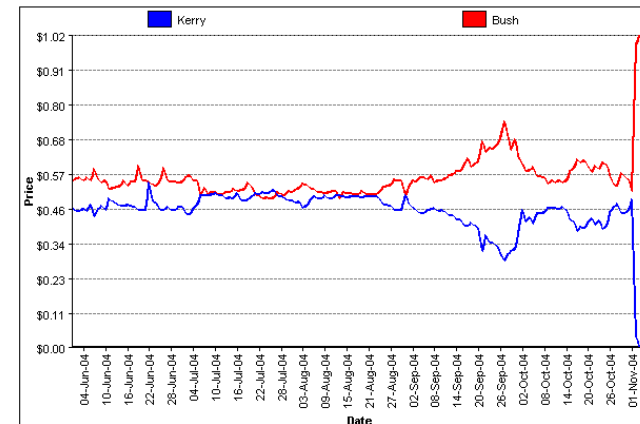


# Prediction Markets: Examples

Companies Using Collective Intelligence Software



Kerry versus Bush Aggregate Probabilities\*



Produced by: Iowa Electronic Markets, University of Iowa Tippie College of Business

HOLLYWOOD STOCK EXCHANGE					
MOVIESTOCKS			STARBONDS		
	<i>Winged Creatures</i>			Kate Winslet	
	[WINGD]			[KWINS]	
	National Treas	H\$125.27 6.30		Chris Columbus	H\$161.40 2.52
	Avatar	H\$74.49 4.50		Bruce Willis	H\$61.59 1.90
	Star Trek	H\$59.55 3.42		Andy & Larry W	H\$114.87 1.89
	Shooter	H\$37.18 -3.42		John Cleese	H\$108.28 -1.89
	Teenage Mutant	H\$64.76 -6.50		Angelina Jolie	H\$107.20 -1.89

**Boeing 787 - When will the Boeing 787 make its maiden flight?**

Boeing 787 to make maiden flight before midnight ET on 31 Dec 2009

Last Price: **47.0**

You can buy this at 47.0 Buy

You can sell this at 36.5 Sell

Explain Trade Now

---

**Afghan Politics - Who will become President of Afghanistan in 2009 Presidential Election?**

Hamid Karzai to be sworn in as President of Afghanistan following the 2009 election

Last Price: **80.0**

You can buy this at 0.0 Buy

You can sell this at 85.0 Sell

Explain Trade Now

[www.intrade.com](http://www.intrade.com)

[http://128.255.244.60/graphs/graph\\_pres04\\_wta.cfm](http://128.255.244.60/graphs/graph_pres04_wta.cfm)

[http://128.255.244.60/graphs/graph\\_pres04\\_wta.cfm](http://128.255.244.60/graphs/graph_pres04_wta.cfm)

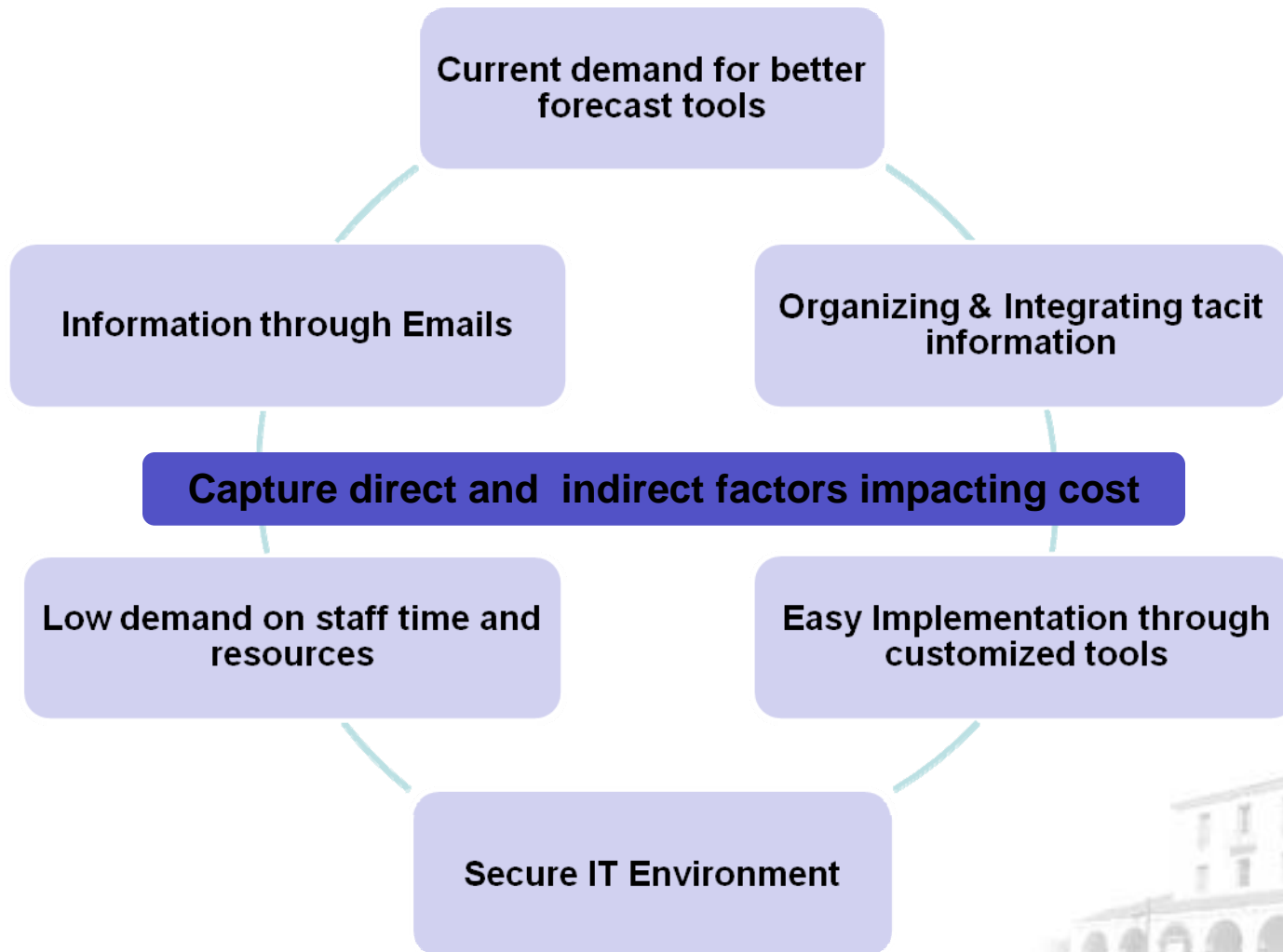
<http://a.fsdn.com/sd/firehose/009/908/692-1.png>



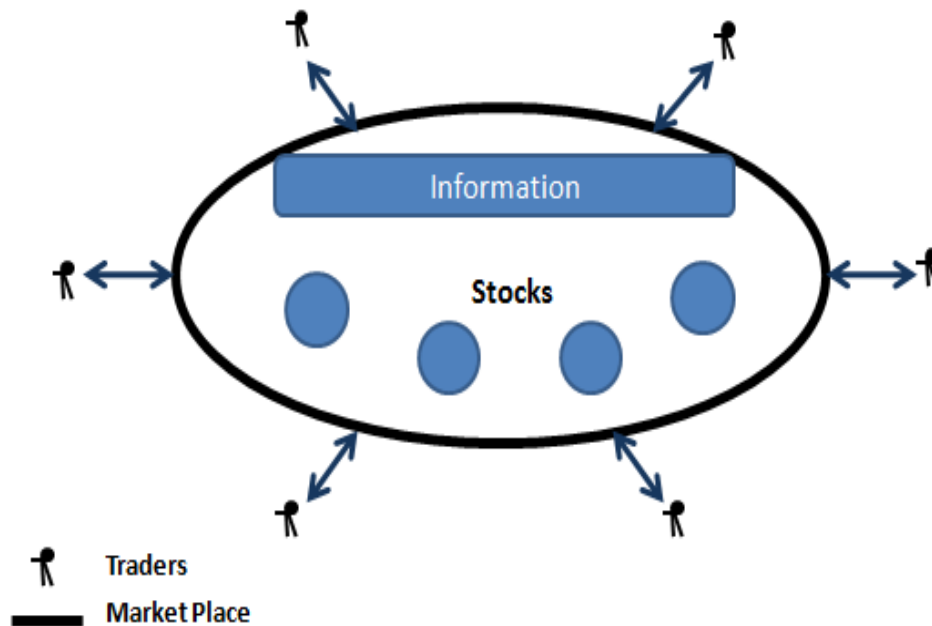
Acquisition Research Program: Creating Synergy for Informed Change

Naval Postgraduate School  
Monterey, CA

# Prediction Markets: Management Tool



# Prediction Markets: Structure & Types



**Winner Takes All**

**Index**

**Spread**



# Prediction Markets: General Principles

---

Unbiased tacit knowledge of crowd

Well - incentivized environments

Non – hierarchical environment

Well defined end dates or closing criteria

Mutually exclusive choices with a definitive outcome





# Prediction Markets: Case Study - SWCS

## Design Components to consider

Stocks

Marketplace

Traders



## Shallow Water Combat Submersible

Implement prediction markets to surface potential program risks, and generate cost /schedule estimates as a supplement to existing estimation methodologies



Collaboration with MITRE  
to share best practices:  
Hanscom Air Force Base



# Prediction Markets: Benefits to SWCS

---

Benefit from the prediction markets event forecasts.

Increased involvement of the participants in anticipating events.

Identifying informal information channels in their organization.

Continuous review of factors impacting cost and schedule

**Agility**

**Efficiency**

**Transparency**



# Prediction Markets: SWCS – Design

---

## Stocks: Designing the Questions

### Questions of the First Order: Program of interest

- Will SWCS be certified by August 1, 2010?
- The cost of the first unit will be \$x.

### Questions of the Second Order: Traders and the trading process

- What is your motivation for trading? (e.g. to win/ to solve the problem/ to validate my knowledge)
- What is your role in the Organization?

### Questions of the Third Order: Behavior outside the markets

- Did trading improve your confidence in your opinion?
- Did Prediction Markets encourage you to change your communication habits?



# Prediction Markets: SWCS - Design

---

## Marketplace

### Software Environment

- Easy to access and use
- Commercially available
- IT security considerations
- Dashboard and administrative capabilities
- Share information
- Close or open new markets

### Market Manager

- Continuous Double Auction
- Automated Market Maker



# Prediction Markets: SWCS - Design

---

## Traders

Markets will be implemented for duration of 3 to 6 months

Traders will include administrative personnel, sub-contracts, engineers, end users, consultants etc

Anonymity of traders will be maintained

Participants from all smaller projects, as well as people from other departments



# Prediction Markets: SWCS - Design

---

## Incentives

Declaring winners based on the maximum portfolio value at market closure

Maintaining a leadership board displaying the top players

Results from the market be used by decision makers and have an influence on real outcomes

Recognition

Opportunity to Contribute

Social Competition



# Prediction Markets: Design Principles

---

**Sufficiently broad following**

**Incentives based on constant participation and ability to predict accurate results**

**Ample historical data**

**Mix of hard and fun questions**

**Anonymity of Participants**



# Prediction Markets: Design Principles

---

Ensure liquidity and avoid volatility

Support of senior management

Compatibility with political and regulatory contexts

Review of market with regular reports

Length of market and closure of questions





# Prediction Markets: Q & A

---



# Prediction Markets: Backup

---



# Prediction Markets: SWCS - Design

## Sample Risk Mapping for First Order Questions

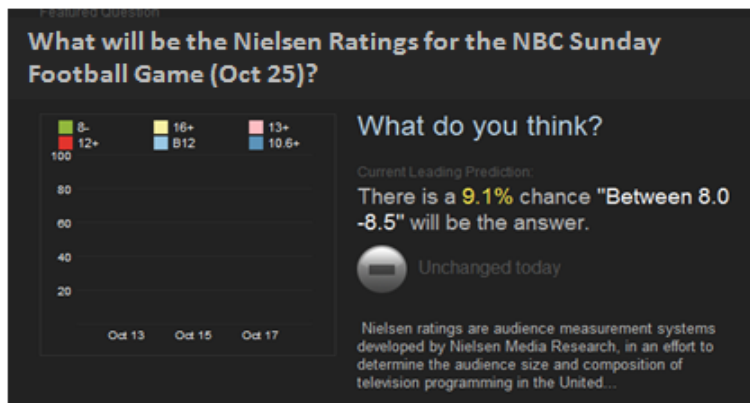
Question Type	First Order Questions	Measured Risk	Alternate way of asking the question	
Type I	Will SWCS be certified by August 1, 2010?	Schedule Overrun	When will SWCS be certified?	Or
			By how many days will the certification date be exceeded?	
Type I	The cost of the first unit will be \$x.	Cost Overrun	What do you think is the most significant cost driver for the first Unit?  Follow up question: Based on the below ranking of cost drivers for the first Unit, what do you think the cost of first Unit will be?	
Type I	The final cost of the program will exceed the baseline estimate by x%.	Cost Overrun		
Type I	What will be the 2011 Fiscal Year appropriation for the SWCS?	Cost and Schedule		
Type II	The SWCS program will be adequately resourced to meet its milestones?	Resource Allocation Errors	By how many days/months will the milestone be missed?	Or
			Which resource do you think is most necessary to meet the program's schedule objective?	Or
			Given the available resources, will the project be able to meet its planned schedule?	



# Prediction Markets: Pilot Studies

## Sunday Night Football : Pilot Study I

- Group of students asked to participate in a private marketplace for predicting the **Nielsen Rating (NBC – USA) for Sunday Night Football (Oct 25)**
- Time – 5 days, Market close 30 minutes prior to game
- Winning Criteria – Generate maximum worth
- Incentive – Points for Class Grade and a popular book for winner
- Minimum of four trades per person
- Each participant allotted \$5000 for trading



### Market Information

**Week 7, Oct. 25: Cardinals at Giants**

The Giants outgamed the Cardinals 37-25 last season, but the Cardinals had the last laugh as they represented the NFC in the Super Bowl. In last year's shootout, Kurt Warner threw for more than 300 yards, but Eli Manning tossed three touchdown passes and the Giants defense limited Arizona to 23 yards rushing. The Cardinals boast perhaps the best receiving tandem in the NFL in Larry Fitzgerald and Anquan Boldin while the Giants rely on a relentless pass rush led by Justin Tuck and Osi Umenyiora.

**Collinsworth:** "The return of Kurt Warner to the only place he didn't have significant success. You know he'd love to put a show on for all the people in New York. Kurt Warner has this game circled on his calendar."

Chris McGrath / Getty Images

www.inklingmarkets.com



# Prediction Markets: Pilot Studies

## Sunday Night Football : Pilot Study I

- Each rating range assigned equal probability (9.09%) to start with (11 ranges)
- Every time a user buys a share for a particular idea, price goes up. Similarly, each time users sell a share, price goes down. Your account will also be credited or debited based on your choice.
- Direct correlation between price and probability – share price of \$9.09 indicates 9.09% chance of that particular rating range.

What will be the Neilson Ratings for the NBC Sunday Football Game (Oct 25)?

Question will be judged on: 10/25/09 @ 05:00 PM PDT

TIP: Current value = probability prediction will occur, e.g. \$10 = 10% chance prediction will occur.

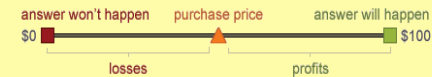
Select a prediction:

PREDICTIONS	CURRENT VALUE	TODAY
Between 8.0-8.5	\$9.09	0.00
Between 8.6-9.0	\$9.09	0.00
Between 9.1-9.5	\$9.09	0.00
Between 9.6-10.0	\$9.09	0.00
Between 10.1-10.5	\$9.09	0.00
Between 10.6 - 11.0	\$9.09	0.00
Between 11.1-12.0	\$9.09	0.00
Between 12.0 - 13.0	\$9.09	0.00
Between 13.0 - 16.0	\$9.09	0.00
Over 16.0	\$9.09	0.00
Below 8.0	\$9.09	0.00

www.inklingmarkets.com

### Buying Shares

- Buying shares means you think this answer will happen.
- The more shares you buy, the stronger you feel this answer will happen.
- If the answer happens, you will make money. If the answer does not happen, you will lose money.

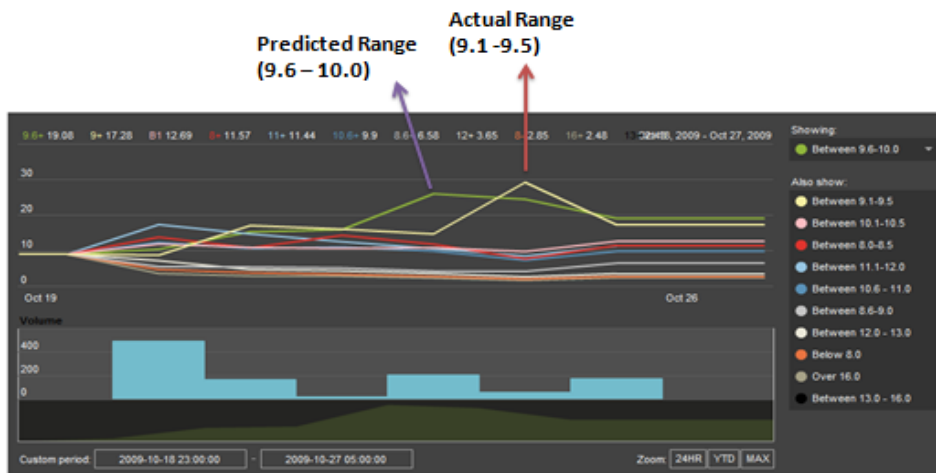


- Your cost is the price you will pay for buying that amount of shares.
- The estimated new price is what impact you will have on the price. Remember, by buying you are saying the probability this will occur is higher than the current price, so we raise the price according to how strongly you (and others) feel.



# Prediction Markets: Pilot Study I Result

- Around 236 trades conducted in total by 17 traders
- **Highest Rating Range (9.6 – 10) (19% chance), followed by range (9.1 – 9.5) (17.3% chance); Actual rating – 9.1**
- World Series game ran into overtime, reducing the ratings for Sunday Night Football



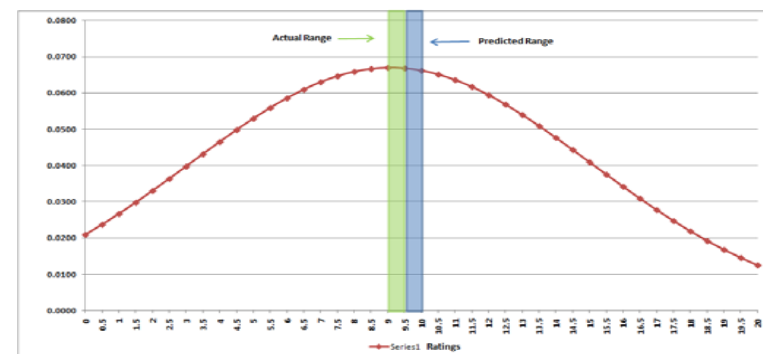
## What will be the Nielsen Ratings for the NBC Sunday Football Game (Oct25)?

Question will be judged on: 10/25/09 @ 05:00 PM PDT

TIP: Current value = probability prediction will occur, e.g. \$10 = 10% chance prediction will occur.

Select a prediction:

PREDICTIONS	CURRENT VALUE	TODAY
Between 9.6-10.0	\$19.08	(closed)
Between 9.1-9.5	\$17.28	(closed)
Between 10.1-10.5	\$12.69	(closed)
Between 8.0-8.5	\$11.57	(closed)
Between 11.1-12.0	\$11.44	(closed)
Between 10.6 - 11.0	\$9.90	(closed)
Between 8.6-9.0	\$6.58	(closed)
Between 12.0 - 13.0	\$3.65	(closed)
Below 8.0	\$2.85	(closed)
Over 16.0	\$2.48	(closed)
Between 13.0 - 16.0	\$2.43	(closed)



www.inklingmarkets.com



Acquisition Research Program: Creating Synergy for Informed Change

Naval Postgraduate School  
Monterey, CA

# Prediction Markets: Pilot Studies

## Monday Night Football : Pilot Study II

- Instead of ranges, participants now saw only one rating. They had to predict if the rating as per their opinion was to be higher or lower. Based on their responses, the price or rating was adjusted automatically.
- The initial rating set was 10
- The price and rating scale was 1:1, i.e. a price of \$10.00 meant the current projected value of rating was 10.00

**What will be the Nielsen Rating (Cable TV – US) for Monday Night Football on ESPN (Nov 2)?** Created by [tm\\_app](#)

Question will be judged on: 11/02/09 @ 05:00 PM PST

SELECTED PREDICTION	CURRENT PRICE
Rating	\$10.00

**TIP:** A price of \$10.00 means the current projected value is 10.00.

Do you think the value will be:

- Greater than 10.00
- Less than 10.00

**HELPFUL INFORMATION**

- You currently own 0 shares worth \$0.00
- Your available balance to trade is \$5,000.00
- A total of 0 shares have been traded. The last trade was at: no trades yet

**MARKET ALERT**

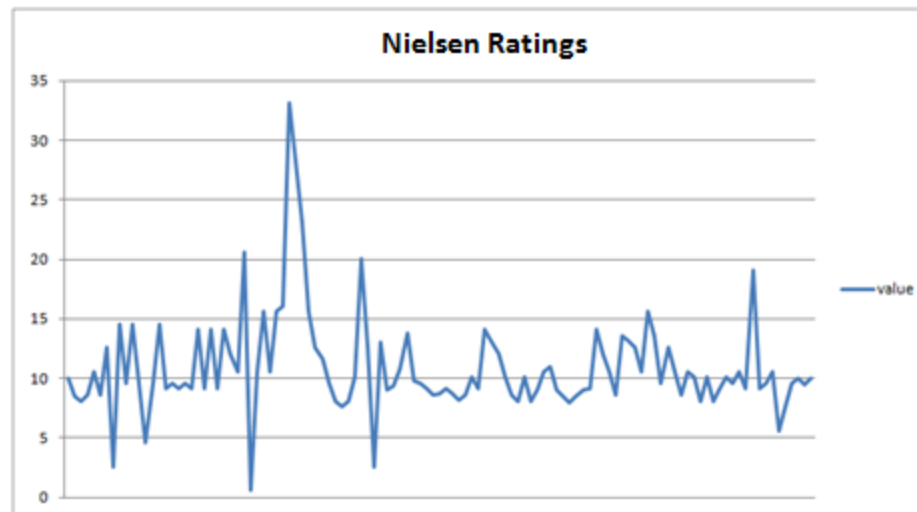
Alert me when the price is greater than  and/or less than   [help](#)



# Prediction Markets: Pilot Study II Result

## Monday Night Football : Pilot Study II

- Around 116 trades were conducted by 13 participants. The final rating predicted by the market was 10.00
- There was a huge variation in the ratings predicted, with the highest value being 33.1 and the lowest value being 0.6
- The actual rating came out to be 7.7 which was not close to the market value.





# Prediction Markets: Observations

---

## Behavioral Observations

- Increased participation due to Internal competition
- Attempts at market gaming
- Trying to make use of First mover advantages
- Forming alliances to manipulate the market
- High incentive to participate led participants to gain more knowledge on the subject.
- Use of statistical models by some participants to forecast ratings



# Prediction Markets: Observations

---

## Useful insights related to implementation

- Ensure enough liquidity
- Avoid volatility by choosing the right scale for trading in market
- Ease of Use
- Ensure regular information update
- Leads to increased awareness and interest
- Align incentives with the participants' interests



# Prediction Markets: Case Study - SWCS

---

**Stocks:** Stocks traded or the questions answered give an indication of the beliefs of the participants, and the number of stocks traded show the level of confidence in their beliefs.

➤ **Type I questions:** Asking these questions can directly provide the required information.

$Q_1 \rightarrow A$

➤ **Type II questions:** Asking these questions can indirectly provide the required information, and a series of questions might be required for getting the information directly.

$Q_2 \rightarrow Q' \rightarrow Q'' \rightarrow A$

