

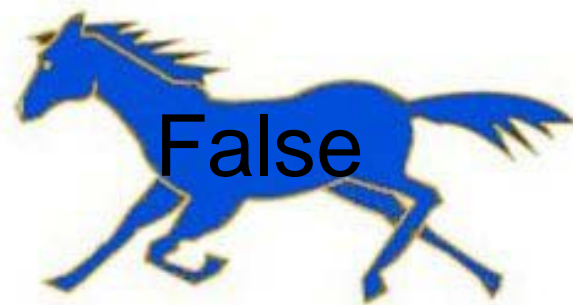
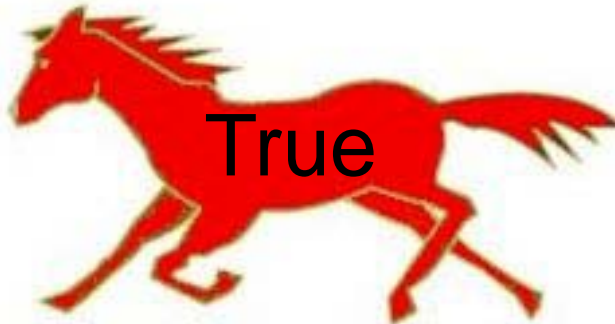
ヒトはいかに群れ、そして間違えるのか

ヒトの意思決定の物理

守 真太郎
久門 正人

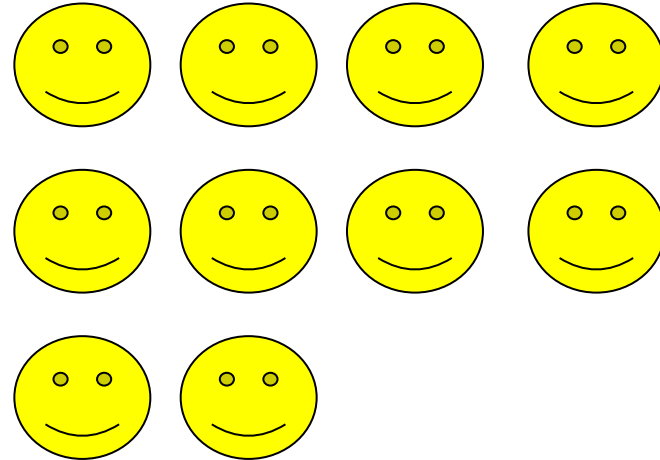
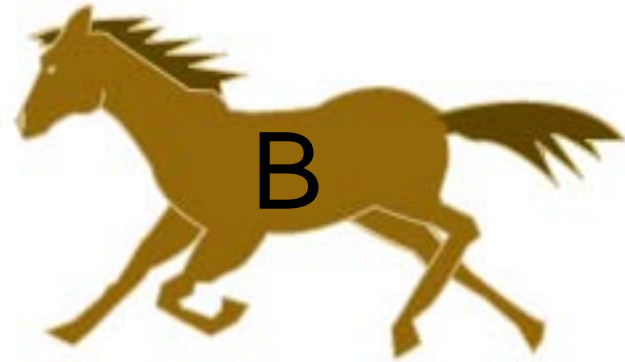
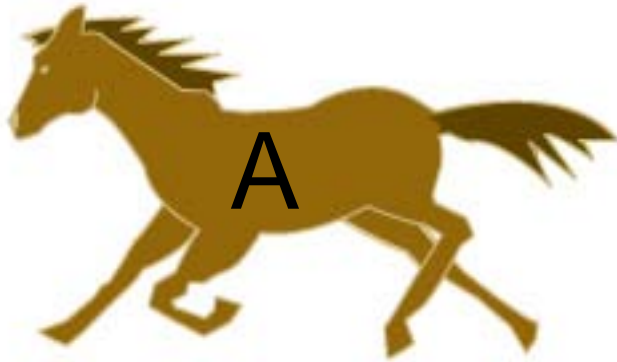
北里大学・理学部・物理学科
Standard and Poors

Quiz : A or B



Private Information

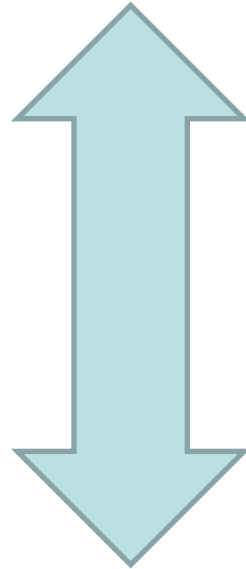
Public Knowledge



Can you trust “Public Knowledge” ?

Microscopic

How one decides ?



Phase Transition

Probability that “the Majority” is False.

α

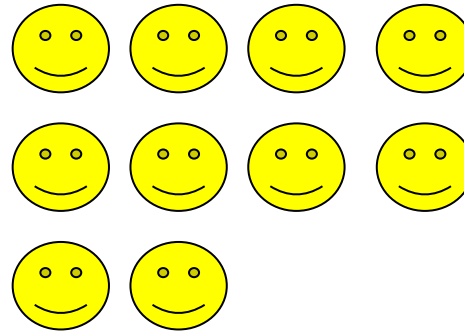
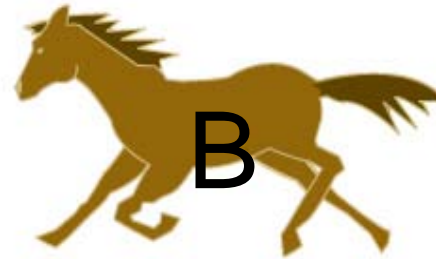
Non-analytic

Macroscopic

Information Cascade

•A.V. Banerjee.1992. S. Bikhchandani, D. Hirshleifer, I. Welch.(1992) I.Welch. June 1992.

Information Cascade



**Private info. is well aggregated
in the Public Knowledge ?**

If Independent → Yes !

If Correlated → No !

(1) Sequential , One by One

(2) One can refer others' chices (not private info.)

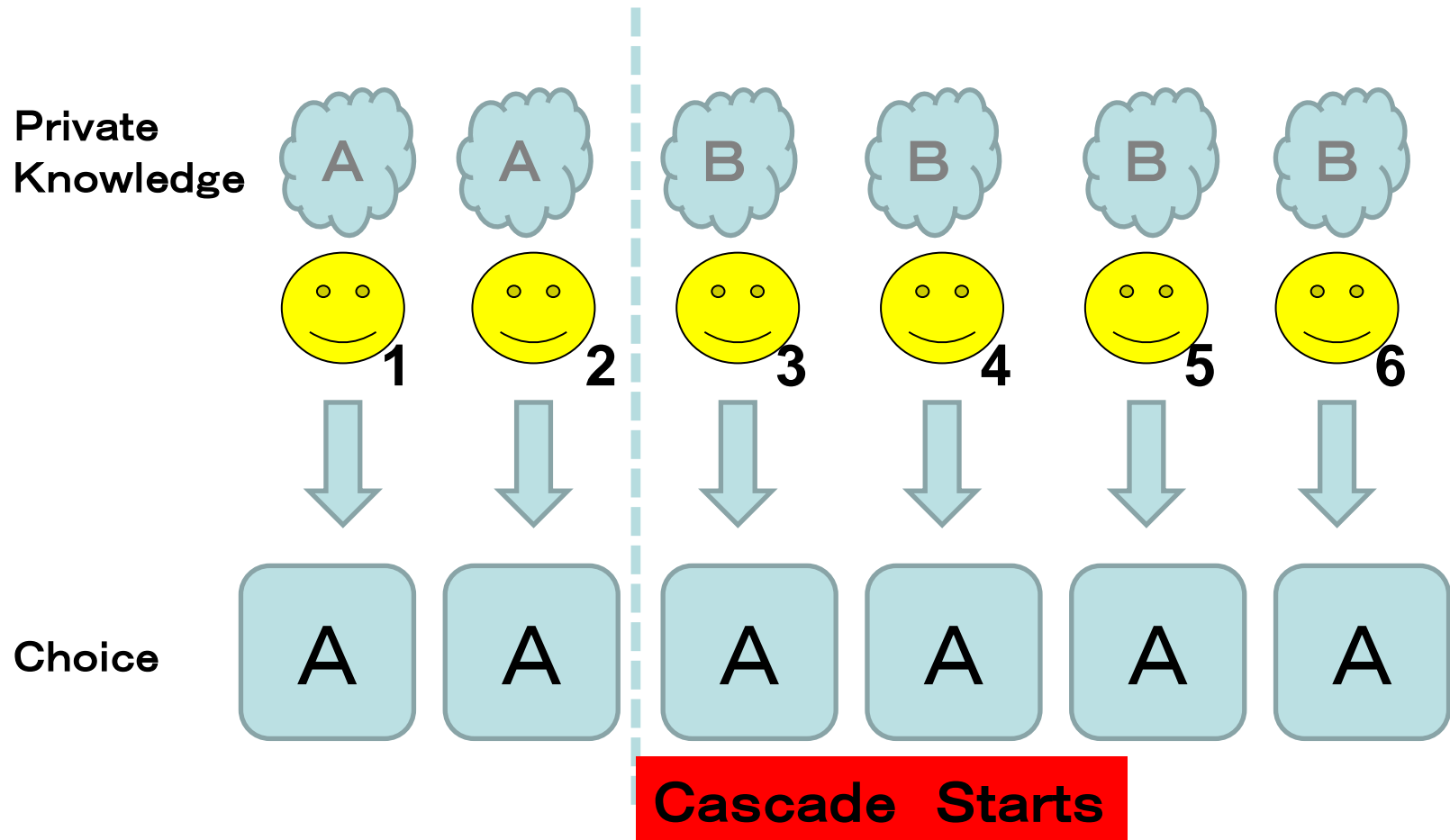


Table 2. Data for Selected Periods of Session 2

Period	Um Used	Subject Number: Um Decision (private draw)						Cascade Outcome
		1st	2nd	3rd	4th	5th	6th	
		round	round	round	round	round	round	
5	B	S12: A (a)	S11: B (b)	S9: B (b)	S7: B (b)	S8: B (a)	S10: B (a)	cascade
6	A	S12: A (a)	S8: A (a)	S9: A (b)	S11: A (b)	S10: A (a)	S7: A (a)	cascade
7	B	S8: B (b)	S7: A (a)	S10: B (b)	S11: B (b)	S12: B (b)	S9: B (a)	cascade
8	A	S8: A (a)	S9: A (a)	S12: B* (b)	S10: A (a)	S11: A (b)	S7: A (a)	cascade
9	B	S11: A (a)	S12: A (a)	S8: A (b)	S9: A (b)	S7: A (b)	S10: A (b)	reverse cascade

Key: Shading -- Bayesian decision, inconsistent with private information.

* -- Decision based on private information, inconsistent with Bayesian updating.

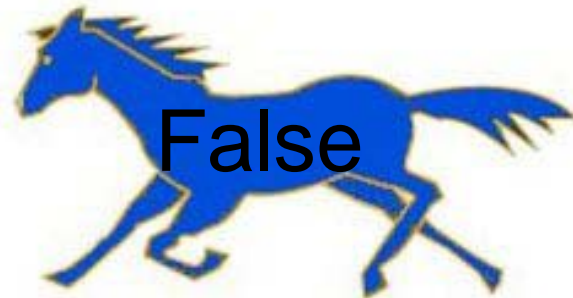
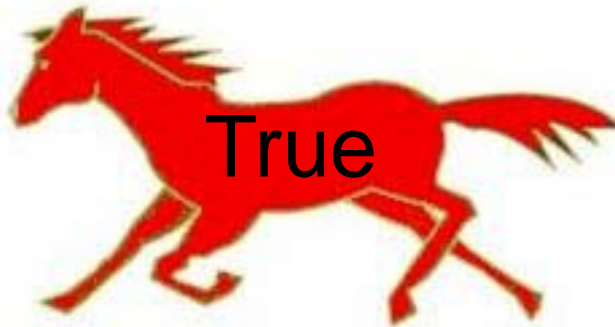
Question

Information Cascade is Fragile or Stable ?

If Stable, Phase Transition ?

Sequential Voting Experiment

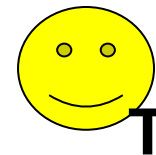
Quiz : A or B



One by one



.....



3000 yen + 1000yen for Top 10 students.
31(=T) *2=62 students, 100 questions. ¹¹

**14: How much is the price on Buggy the Clown ?
The captain of Buggy's pirates. (at 2010.9.1)**

- A. 13 millions B
- B. 15 millions B

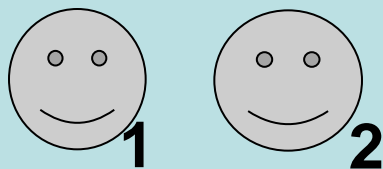


Without Information

One by one

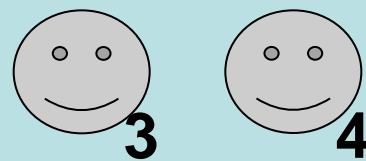


A



$$N_A(31) = 13$$

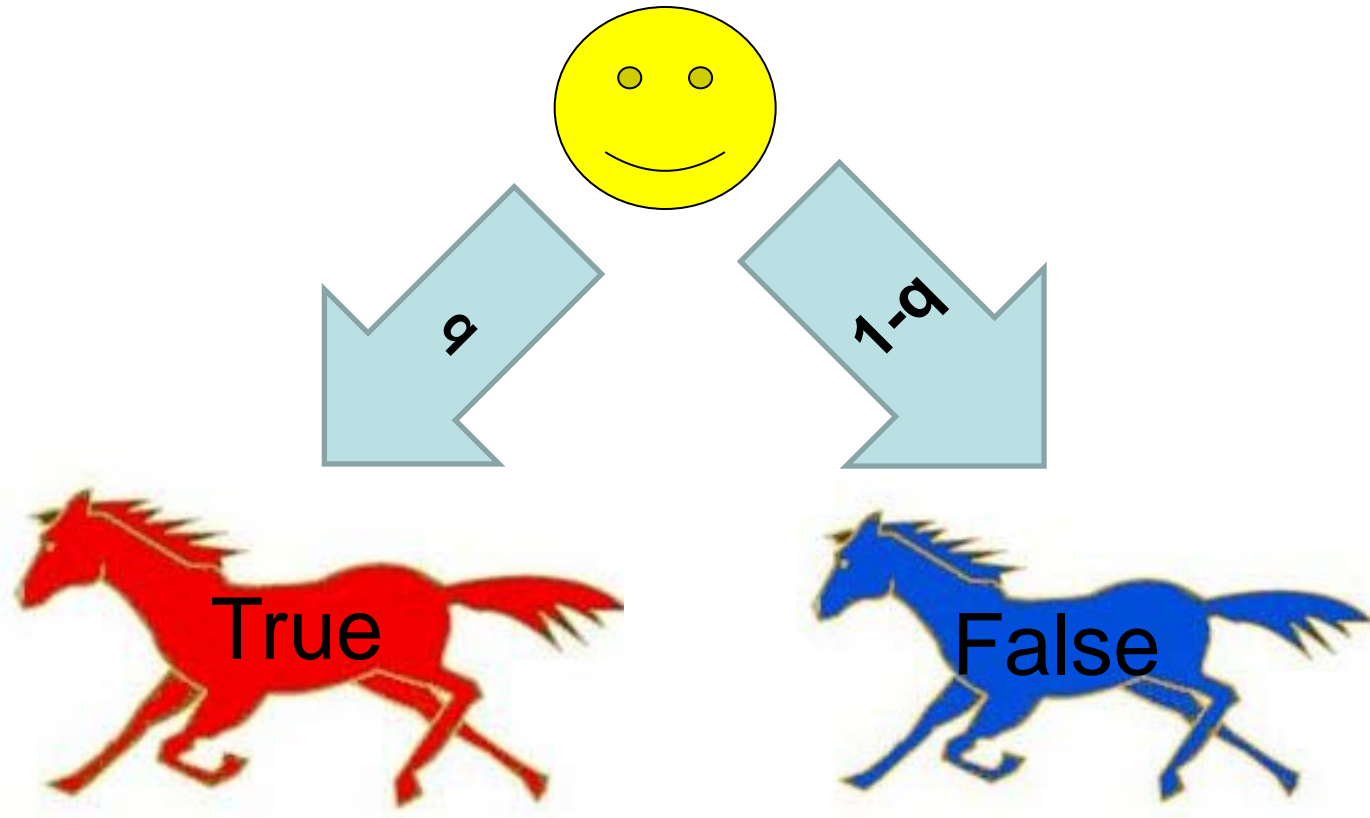
B



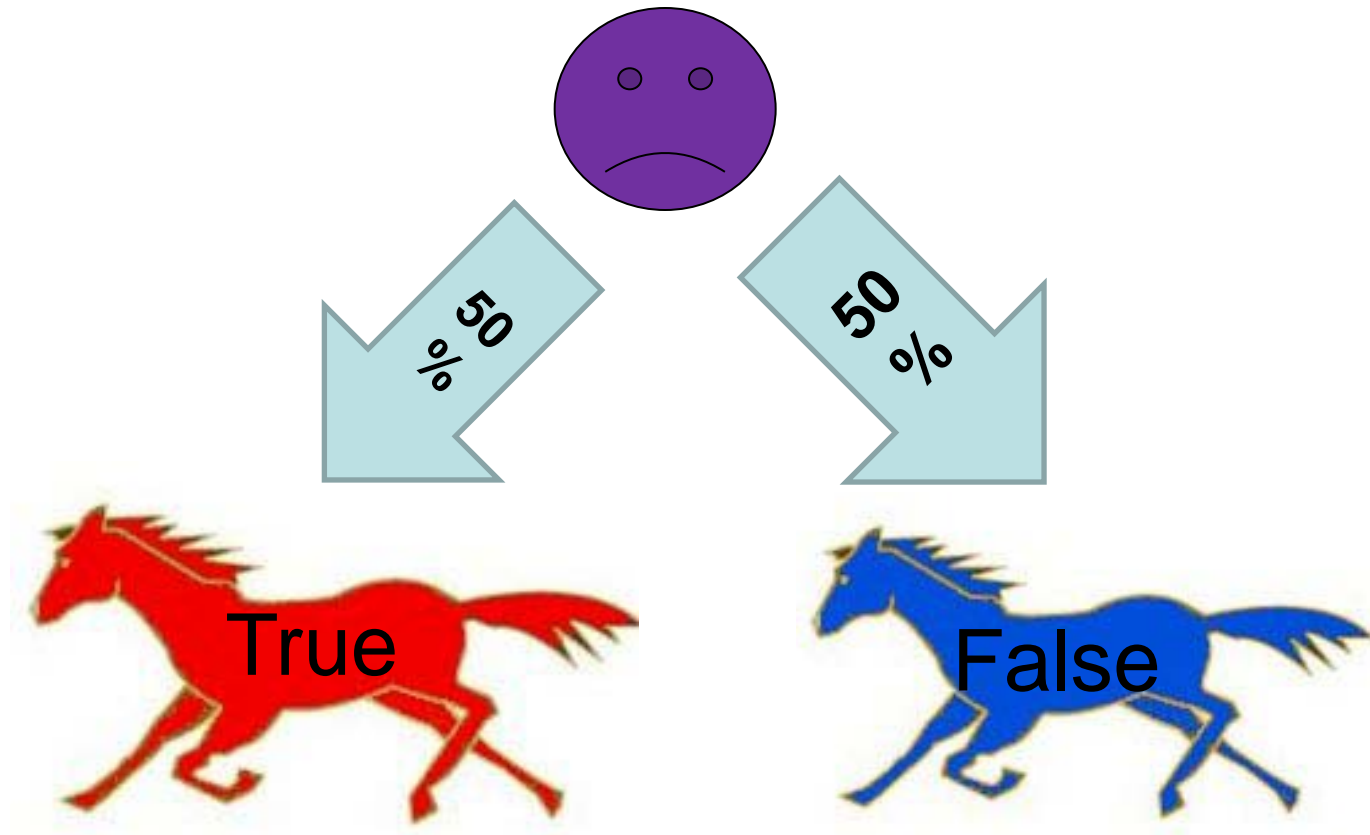
$$N_B(31) = 18$$

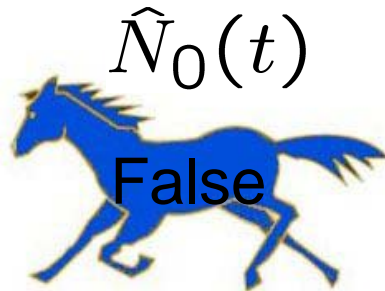
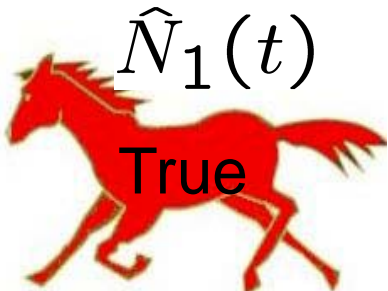
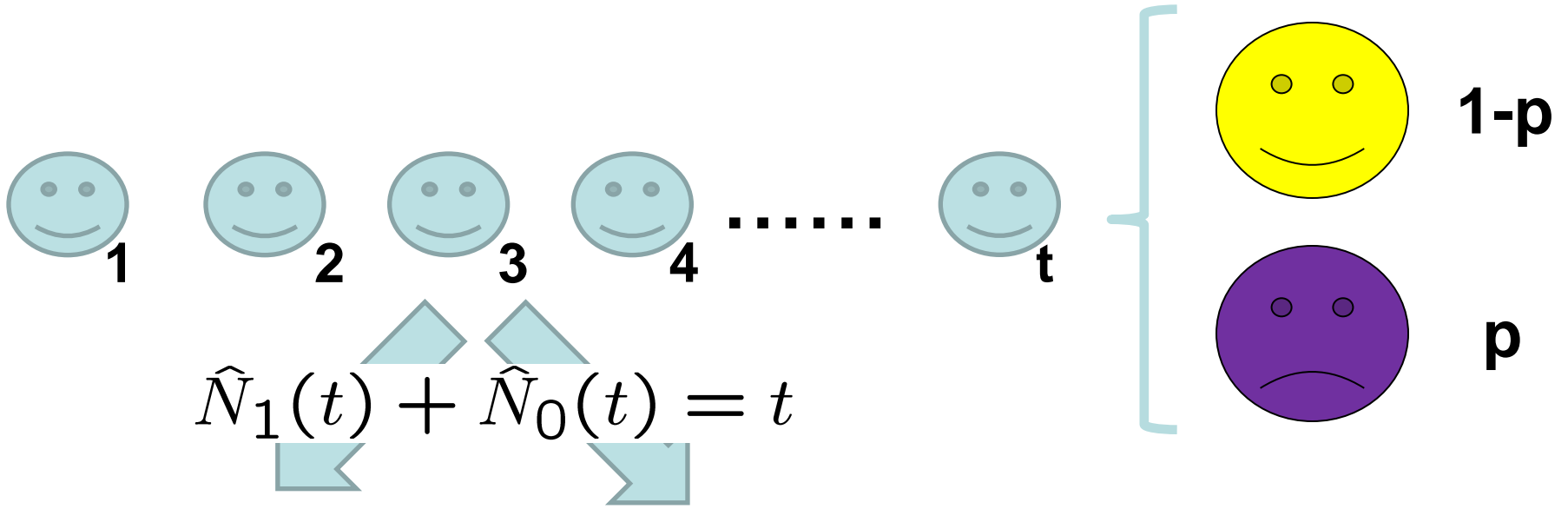
Independent Voter

who knows the answer with prob. $q=100\%$.
who is not affected by others' choices.



Stupid Voter (Herder, Herding Voter)
who does not know the answer.





$$E \left[\frac{\hat{N}_1(t)}{t} \right] = (1 - p) + 0.5 \cdot p = 1 - 0.5 \cdot p$$

$$E \left[\frac{\hat{N}_0(t)}{t} \right] = 0.5 \cdot p$$



Result

$$N_1(31) = 18$$


$$N_0(31) = 13$$




$$1 - \frac{1}{2}p = \frac{18}{31}$$



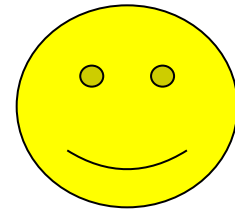
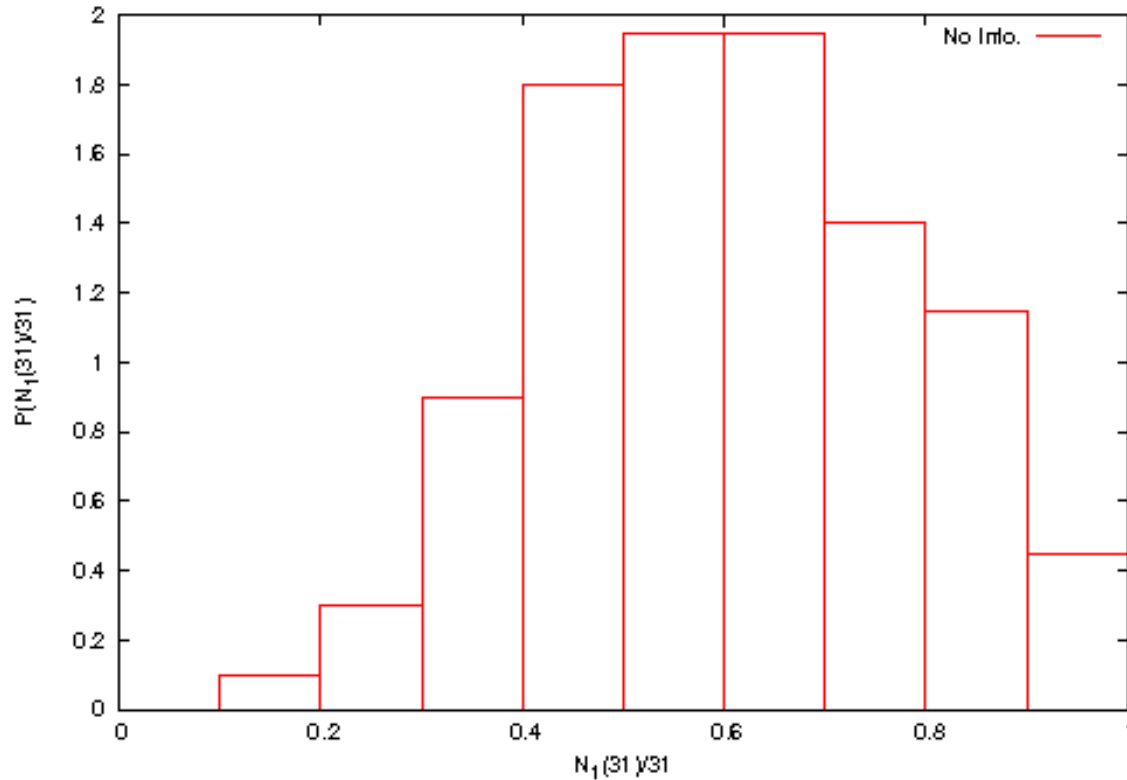
$$p_{MLE} = \frac{26}{31}$$

 A. 13 millions

 B. 15 millions

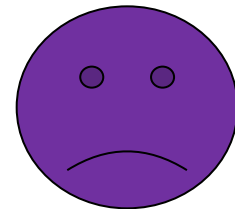
$$P(\hat{N}_1(T)/T)$$

$T = 31,200$ quiz



20%

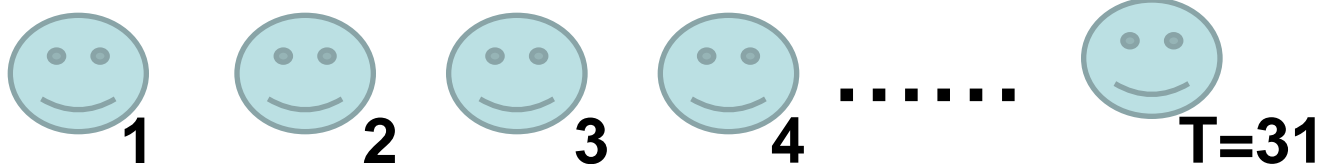
$$E\left[\frac{\hat{N}_1(T)}{T}\right] = 1 - 0.5 \cdot p \simeq 0.6 \Rightarrow p \simeq 0.8$$



80%

With Information

One by one t



A



$$N_A^\infty(31) = 30$$

B

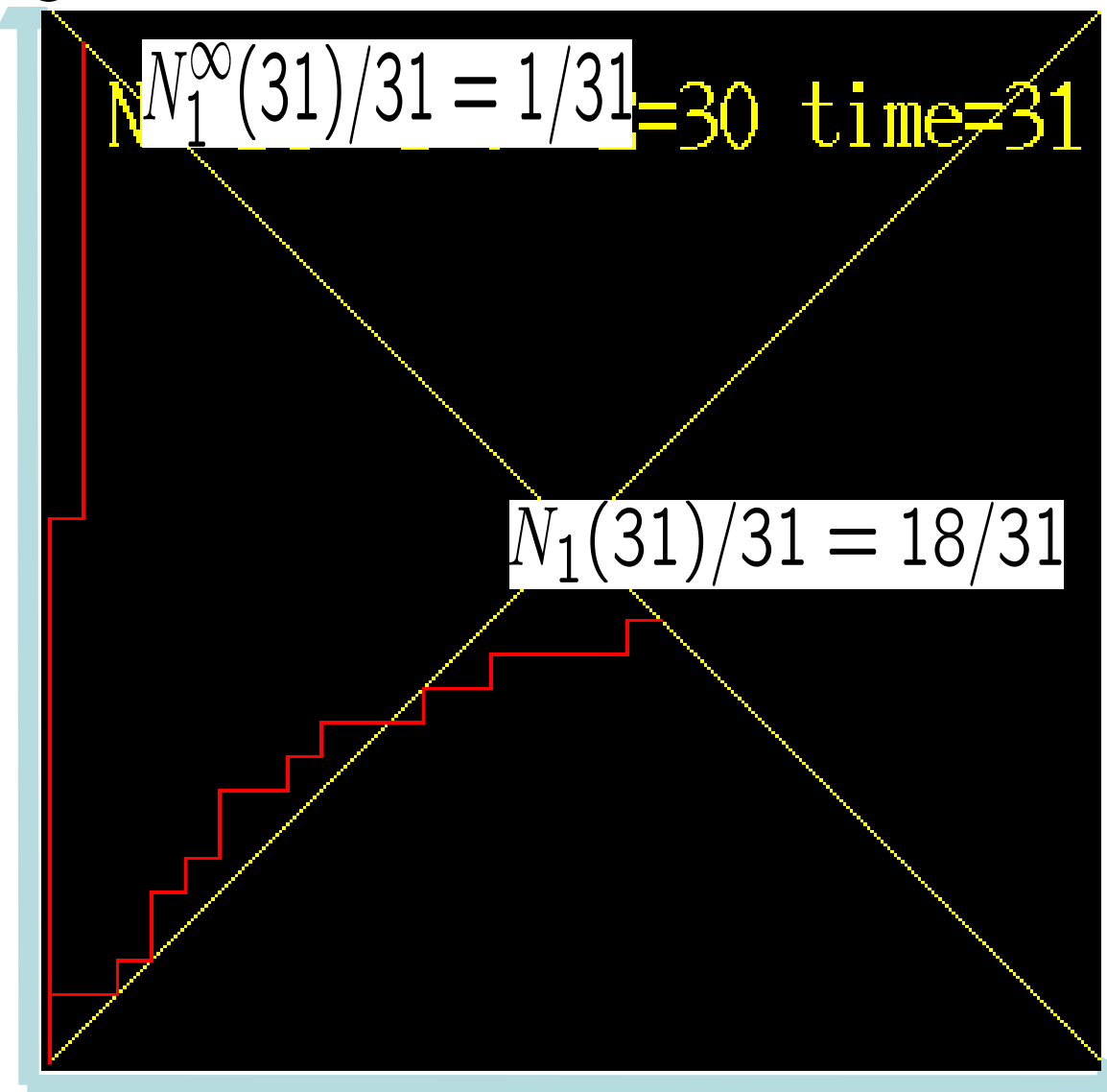
$$N_B^\infty(31) = 1$$

N_0

$N_0=14$ $r=0$ $\text{time}=0$

N_1

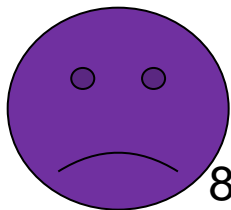
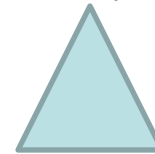
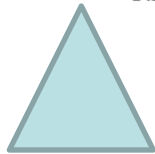
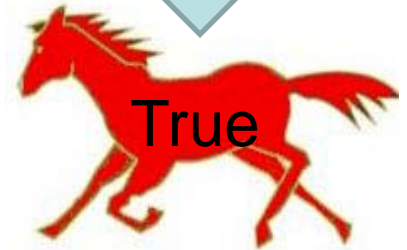
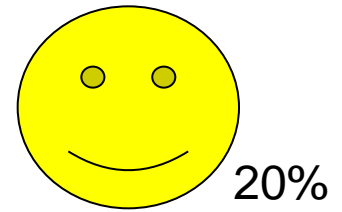
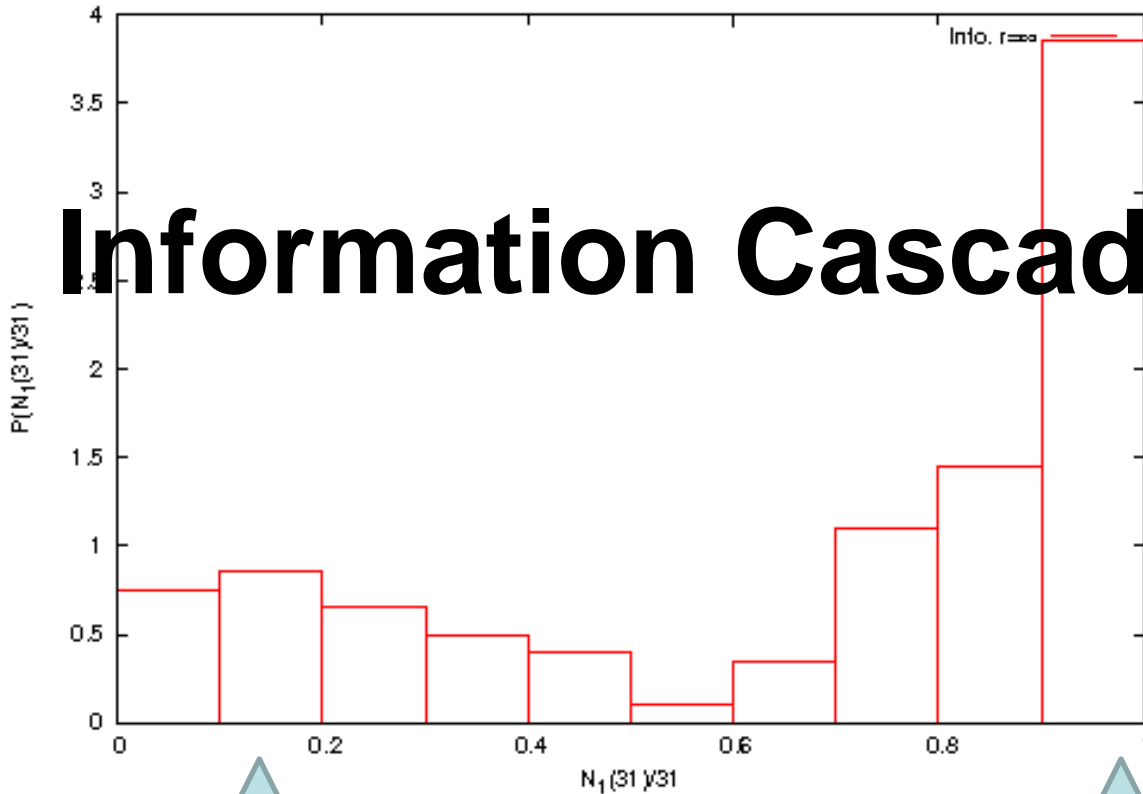
N_0



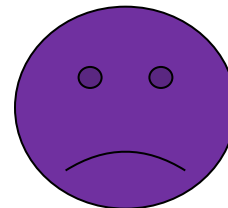
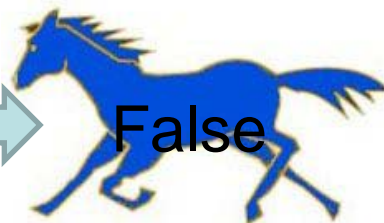
N_1

$$P(N_1^\infty(T)/T)$$

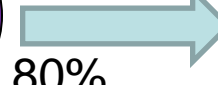
Information Cascade



80%



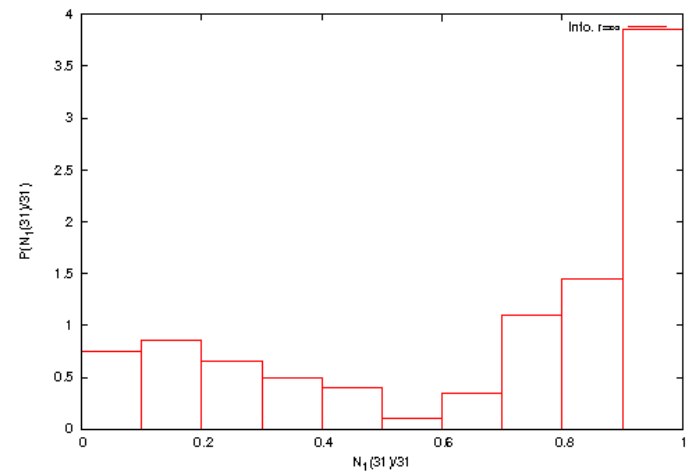
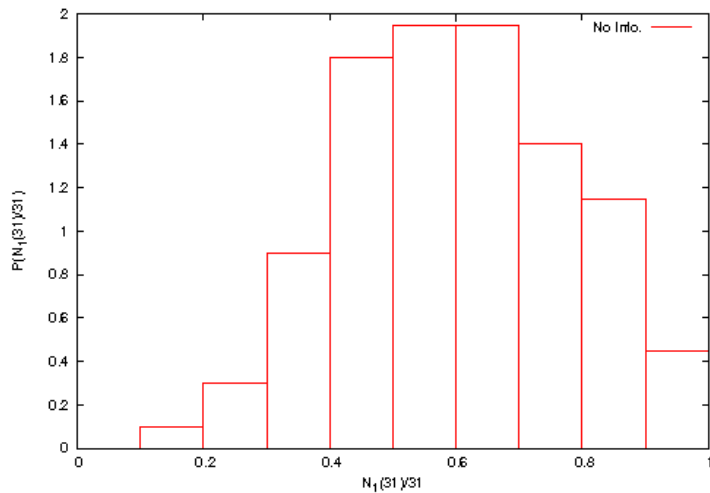
80%



22

Question

What is the Physics
in the Information Cascade ?



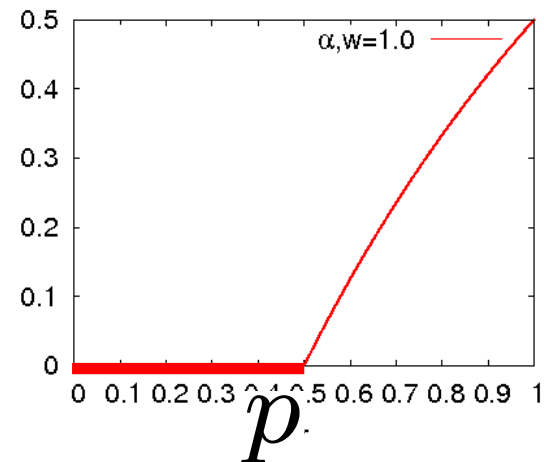
Conclusion

The Information Cascade is
a second-order phase transition.

If $p > p_c$ the Prob. that  condenses to  False becomes >0


 α

α



Voting Model

Exact Scale Invariance in Mixing of Binary Candidates in Voting Model
S. Mori and M. Hisakado, J.Phys.Soc.Jpn,79,vol.3(2010)034001-034008.

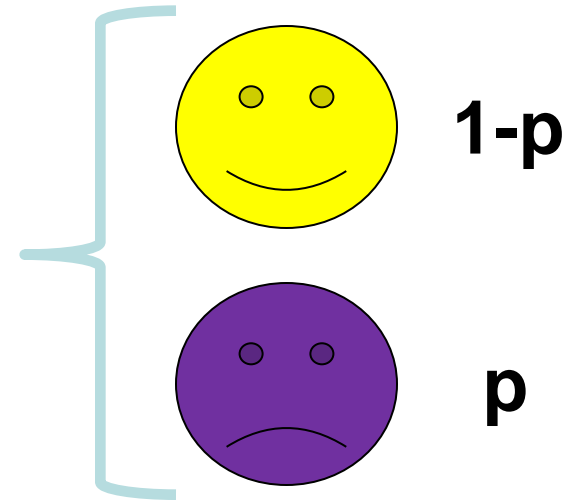
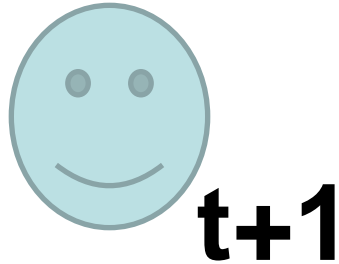
Phase transition and information cascade in voting model
M. Hisakado and S.Mori, J.Phys.A,Math.Theor.43(2010)315207.

Component Ratios of Independent and Herding Bettors in a Racetrack
Betting Market, S.Mori and M.Hisakado, preprint arXiv:1006.4884.

Horse Race
Betting

Digital herders and phase transition in a voting model
M.Hisakado and S.Mori,J.Phys.A,Math.Theor.44(2011)275204

Voting Model with Digital Herder



$$(1-p) + p \cdot \theta(N_1^r(t) - N_0^r(t))$$

$$p \cdot \theta(N_0^r(t) - N_1^r(t))$$

Truth

$$N_1^r(t)$$

False

$$N_0^r(t)$$

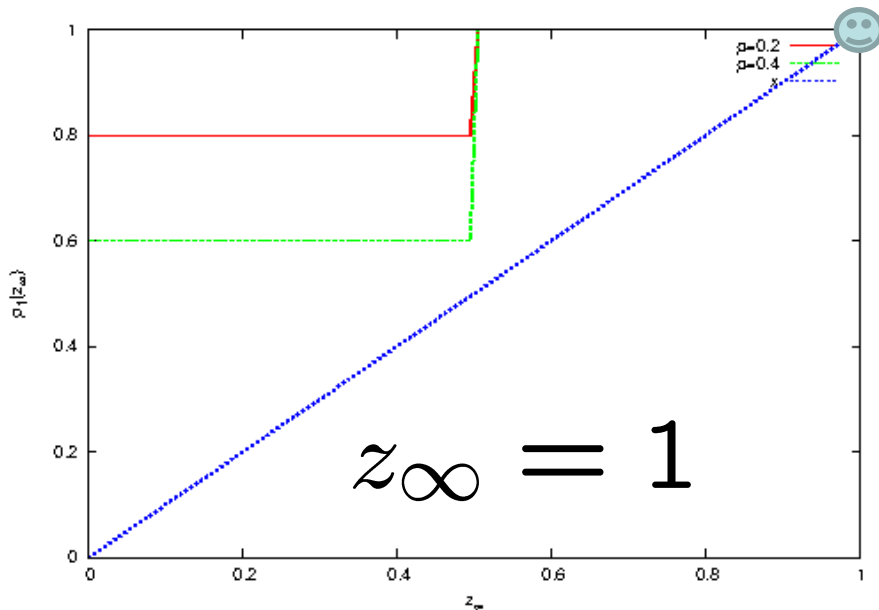
Mean Field Eq. $r = \infty, t \rightarrow \infty$

$$\lim_{t \rightarrow \infty} \frac{N_1^\infty(t)}{t} = z_\infty$$

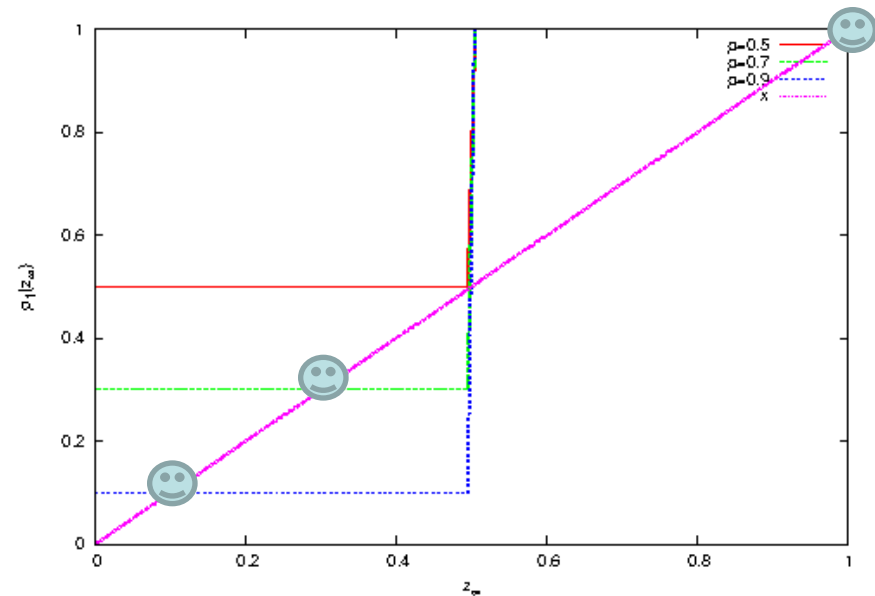
$$z_\infty = (1 - p) + p\theta(z_\infty - \frac{1}{2})$$

$$p < p_c = \frac{1}{2}$$

$$p \geq p_c$$



$$z_\infty = 1$$



$$z_\infty = 1 - p$$

$$z_\infty = 1$$

Mean Field Eq.

$$\text{Prob}(\hat{X}_{t+1} = 1) = (1 - p) + p\theta\left(\sum_{s=1}^t \hat{X}_s - \frac{1}{2}t\right)$$

$$z_\infty \equiv \lim_{t \rightarrow \infty} \text{Prob}(\hat{X}_t = 1) = \lim_{t \rightarrow \infty} E(\hat{X}_t)$$


$$\text{Prob}\left(\sum_{s=1}^t \hat{X}_s = n\right) \equiv P(t, n) = {}_t C_n \cdot z_\infty^n (1 - z_\infty)^{t-n}$$

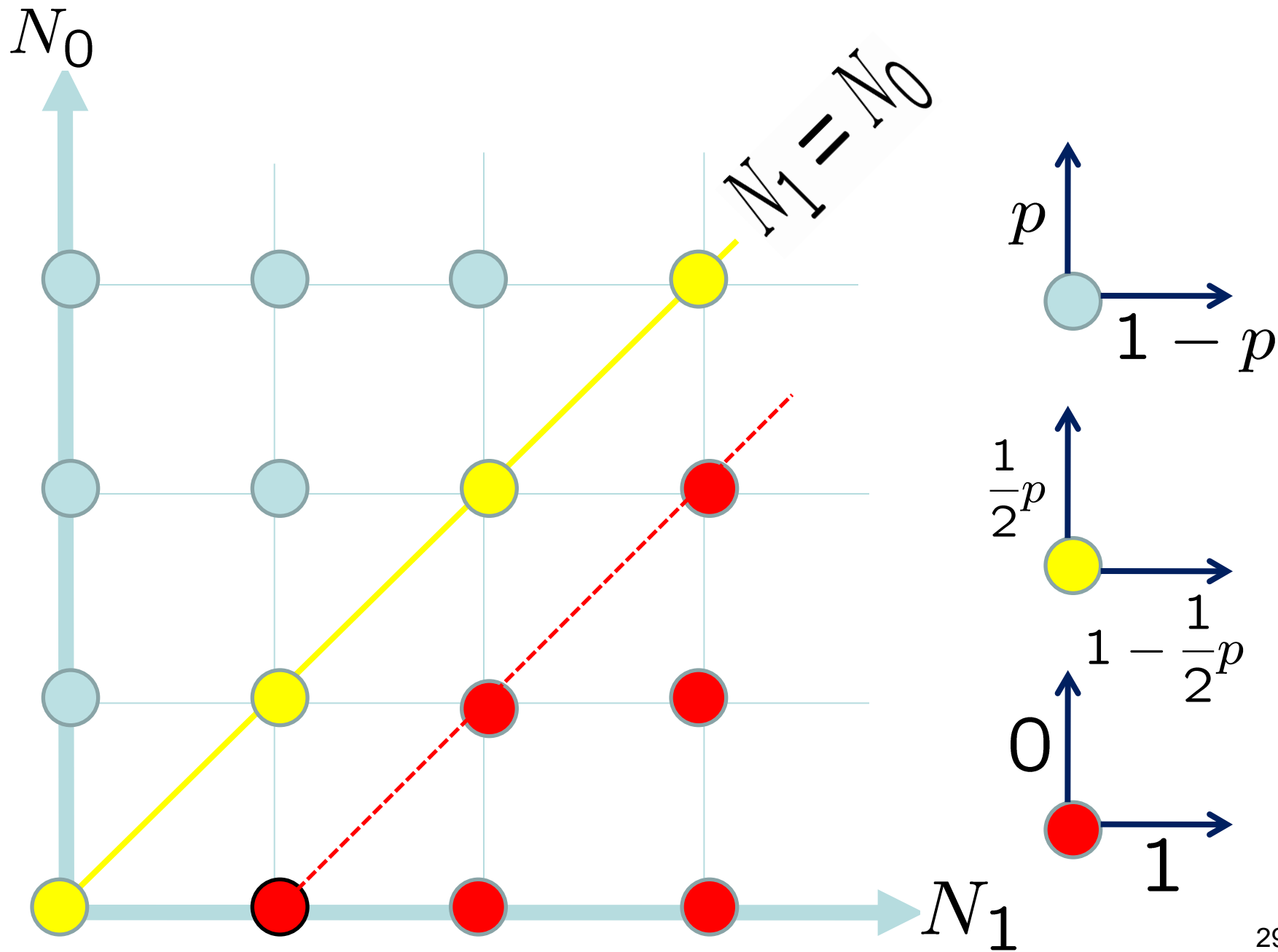
Self-Consistent eq.

$$E(\text{Prob}(\hat{X}_{t+1} = 1)) = (1 - p) + p \cdot \sum_{n=1}^t P(t, n) \theta\left(n - \frac{1}{2}t\right)$$

$$t \rightarrow \infty (r = \infty)$$

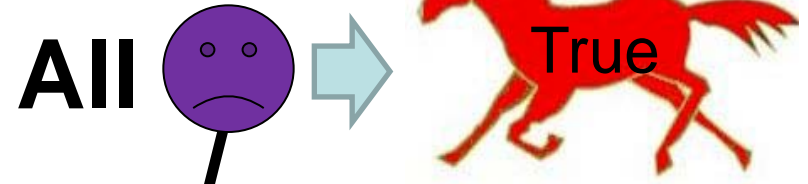
$$\lim_{t \rightarrow \infty} P(t, n) = \lim_{t \rightarrow \infty} {}_t C_n z_\infty^n (1 - z_\infty)^{t-n} = \delta_{n,t} \cdot z_\infty$$


$$z_\infty = (1 - p) + p\theta\left(z_\infty - \frac{1}{2}\right)$$

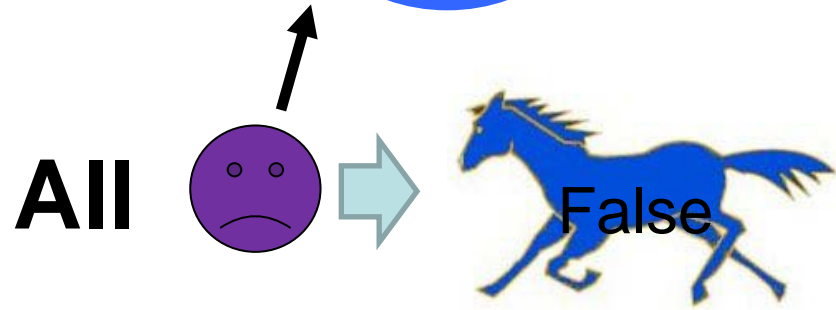


1: Truth

$$N_1^\infty(t)$$

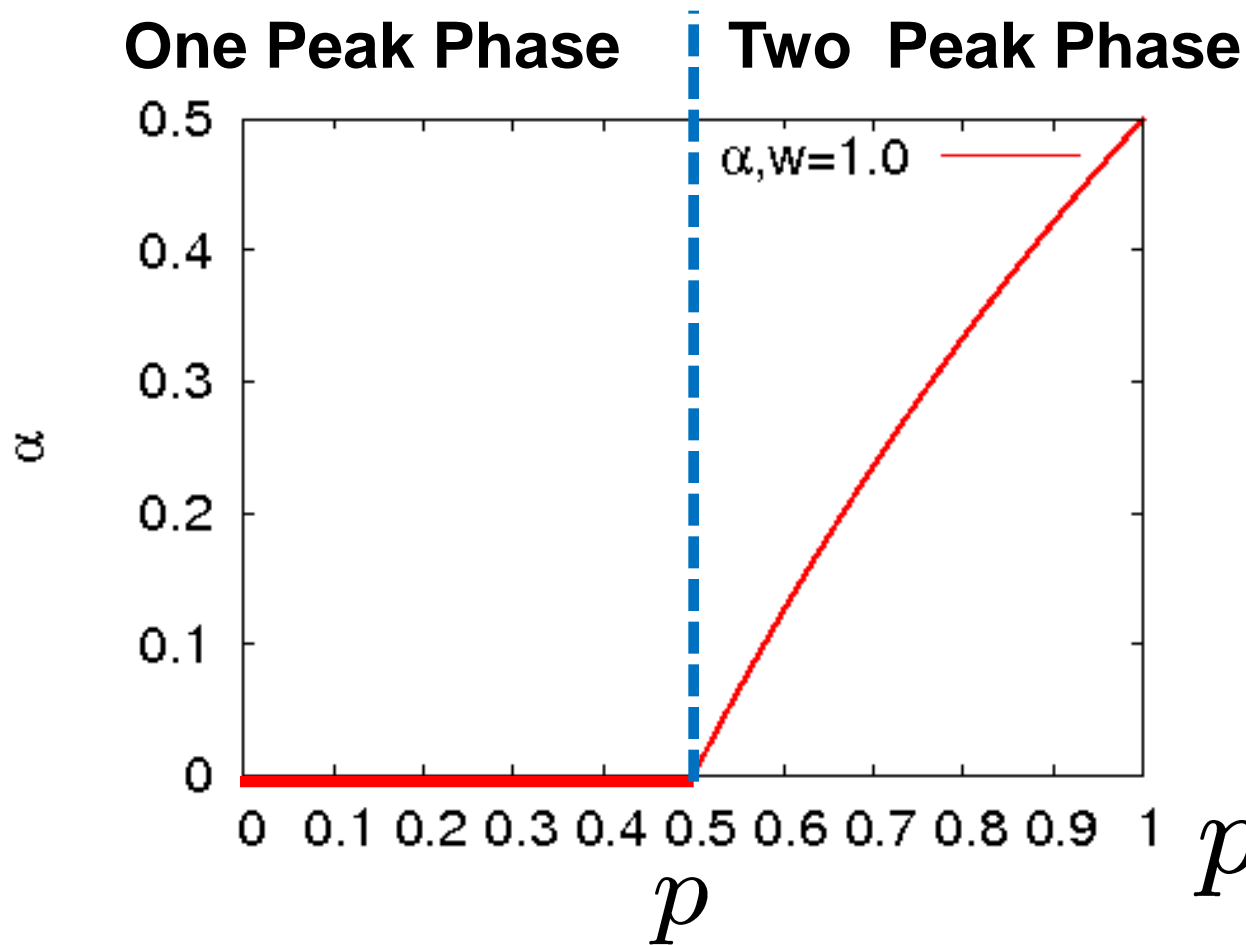


$$\hat{Z}(t) \equiv \frac{\hat{N}_1^\infty(t)}{t} \sim \alpha \delta_{1-p} + (1 - \alpha) \delta_1 \quad t \rightarrow \infty$$



$$\alpha = \frac{2p - 1 + |2p - 1|}{3 + |2p - 1|}$$

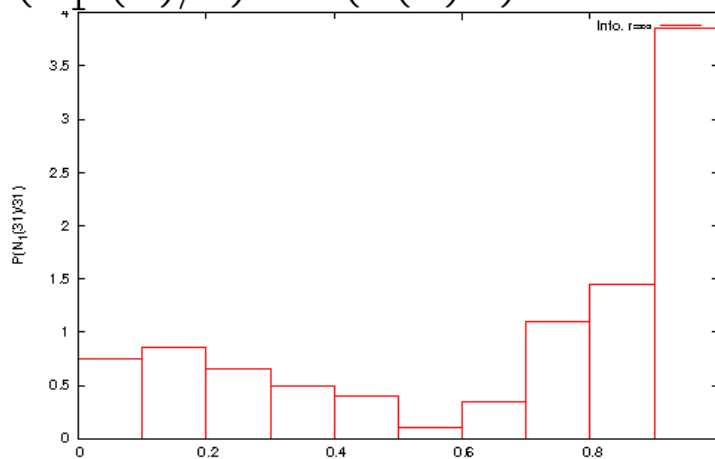
$\alpha = \text{Prob. (All } \textcircled{\text{f}} \rightarrow \text{False)}$



$$p_c = \frac{1}{2}$$

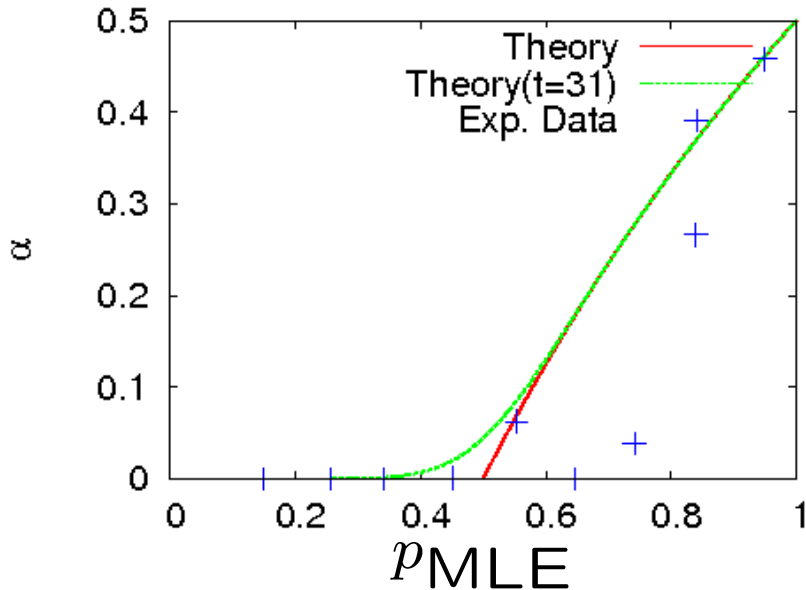
Theory vs Experiment

$$P(N_1^\infty(T)/T) = P(Z(T)^\infty)$$



$$\lim_{t \rightarrow \infty} \hat{Z}(t) = \alpha \delta_{1-p} + (1 - \alpha) \delta_1$$

$$p = 0.8$$

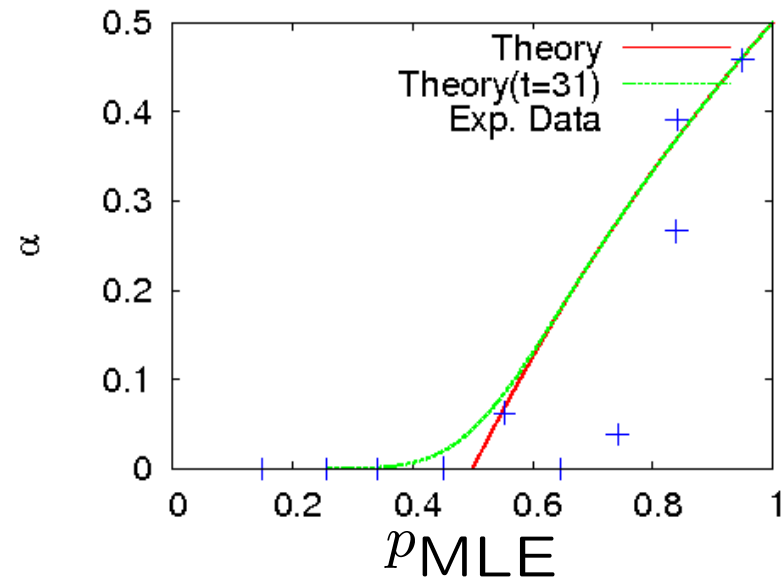
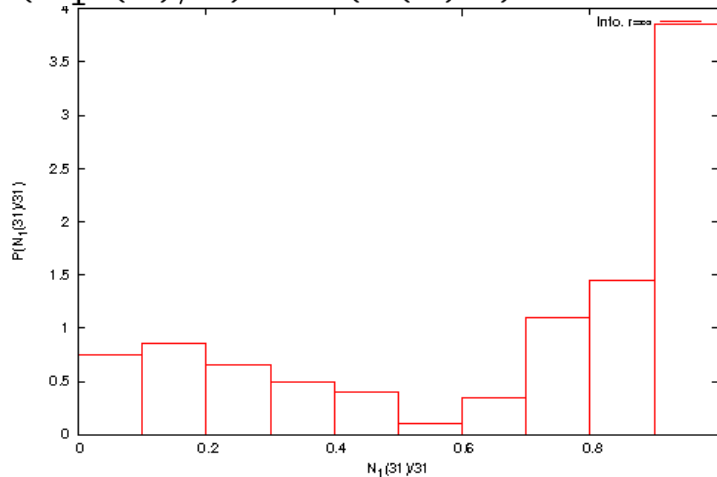


$$\alpha = \frac{2p - 1 + |2p - 1|}{3 + |2p - 1|}$$

Conclusion 1

The Information Cascade is a second-order phase transition.

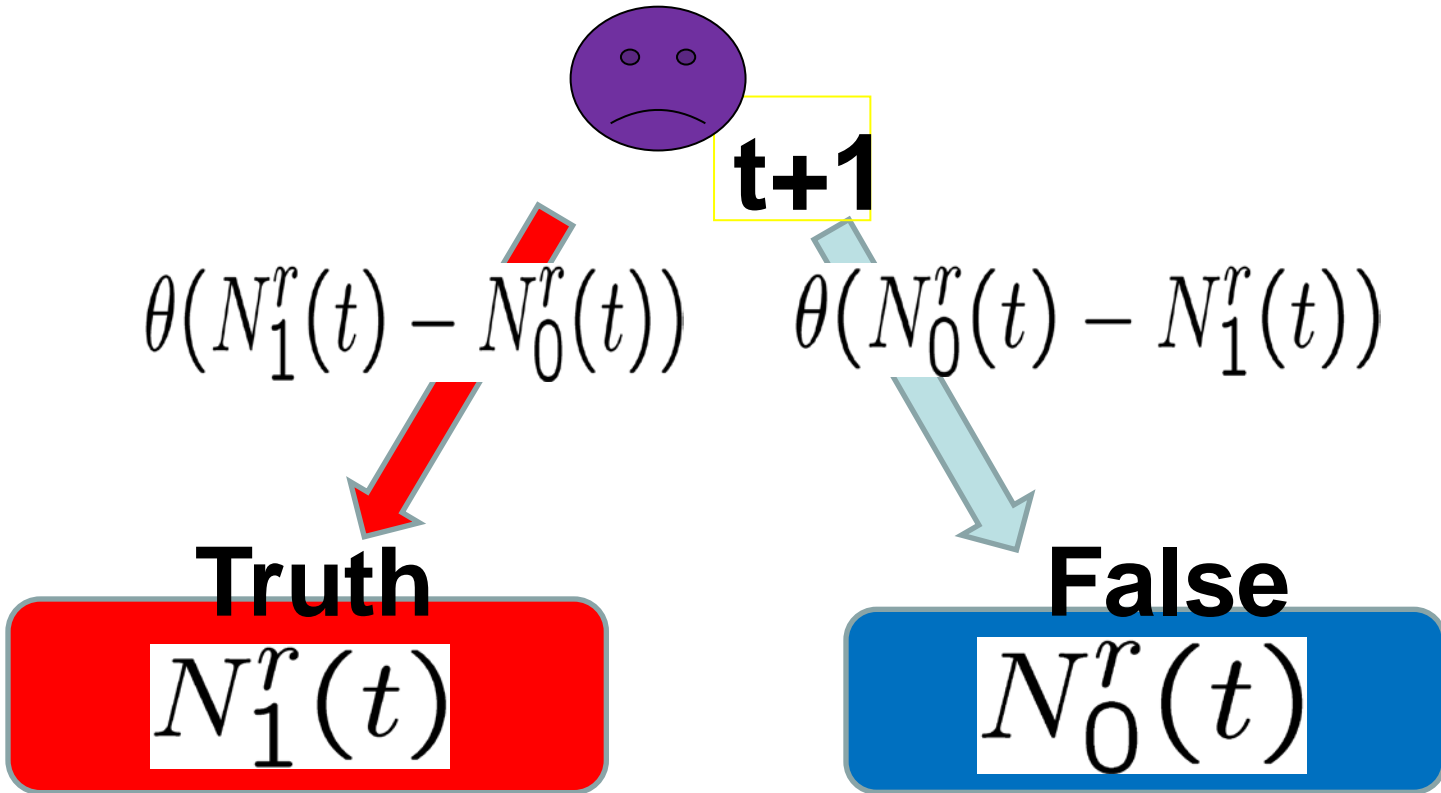
$$P(N_1^\infty(T)/T) = P(Z(T)^\infty)$$



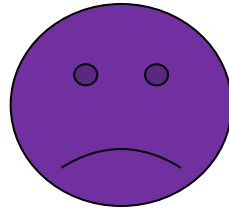
Digital herders and phase transition in a voting model

M.Hisakado and S.Mori, J.Phys.A, Math.Theor.44(2011)275204

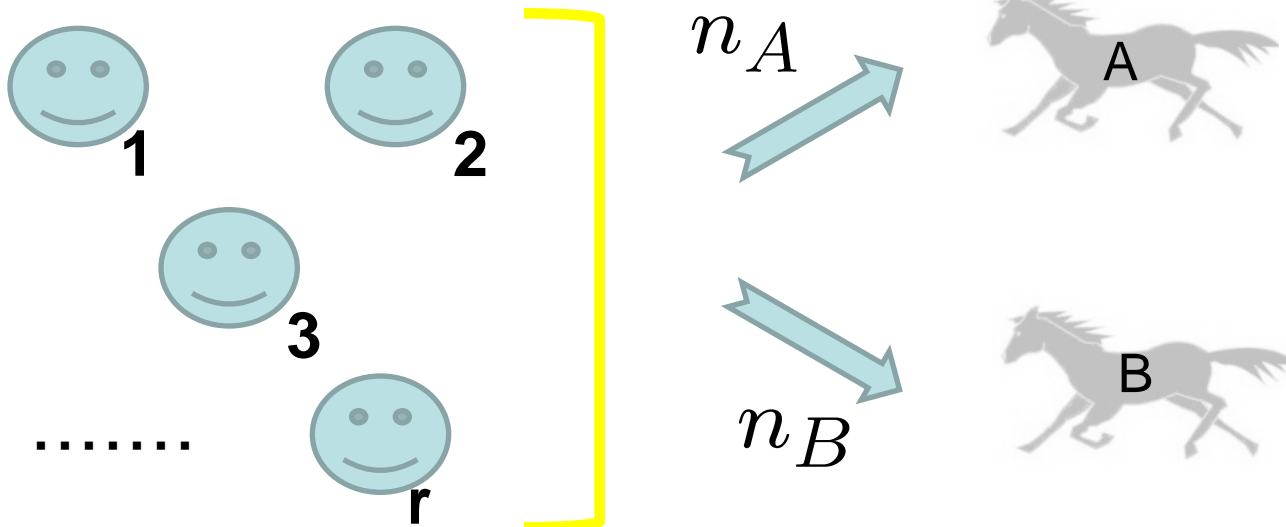
He votes as digital herder ?



How he should votes ?



r voters



$$\Pr(\hat{X}_i = 1) = q$$



How he estimate ?

$$\Pr(A = \text{True} | n_A = n), \text{Prob}(B = \text{True} | n_B = r - n)$$

Answer from Bayes' theorem

$$\Pr(A = \text{True} | n_A = n) = \frac{1}{2}(\tanh(\lambda(n - (r - n))) + 1)$$

$$\lambda = \log \sqrt{\frac{q}{1 - q}}$$

If $|n_A - n_B| \gg 0$ or $q \gg \frac{1}{2}$

$$\Pr(A = \text{True} | n_A) = \theta(n_A - n_B)$$

$$T \rightarrow \infty$$

If 😊 are independent,

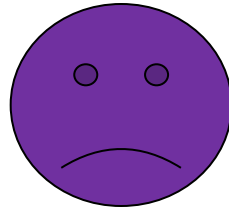
$$\Pr(\text{Majority}=\text{True}) = 1$$

If 😊 are independent+digital herder,

$$\Pr(\text{Majority}=\text{True}) = 1 - \alpha$$

$$\alpha = \frac{2p - 1 + |2p - 1|}{3 + |2p - 1|}$$

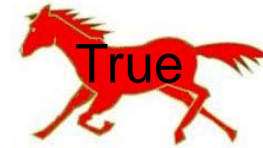
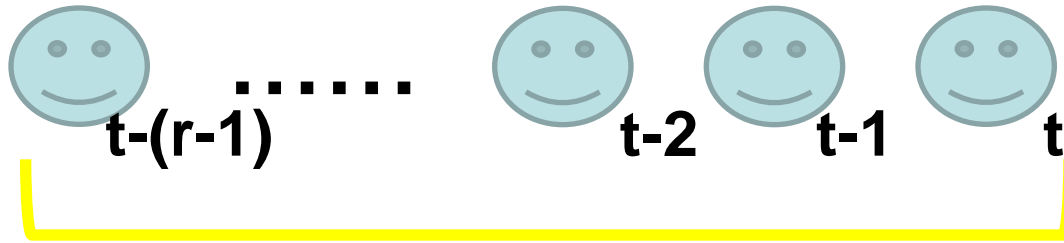
How he votes ?



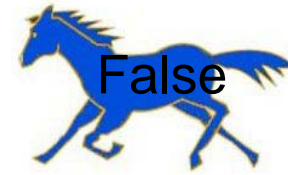
Control of information transmission

One by one t

Recent r voters

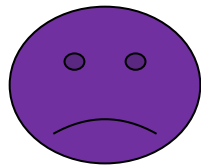


$\hat{N}_1^r(t)$



$\hat{N}_0^r(t)$

$$\hat{N}_1^r(t) + \hat{N}_0^r(t) = r$$

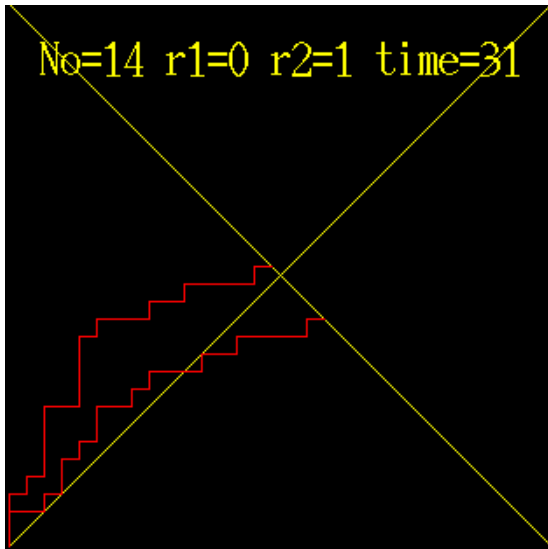


$t+1$

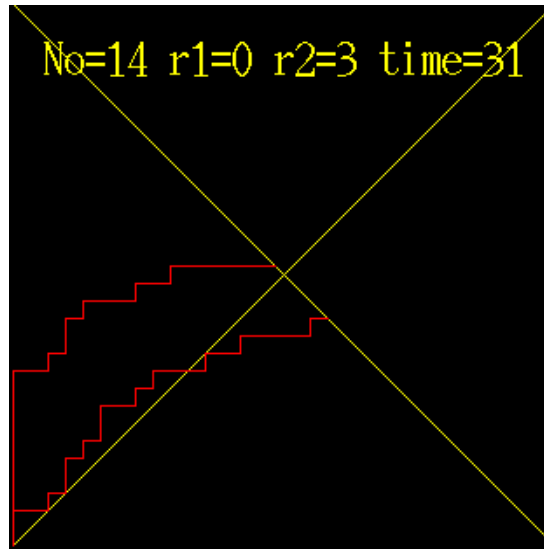
How he votes ?

$$p_1(r, N_1^r)$$

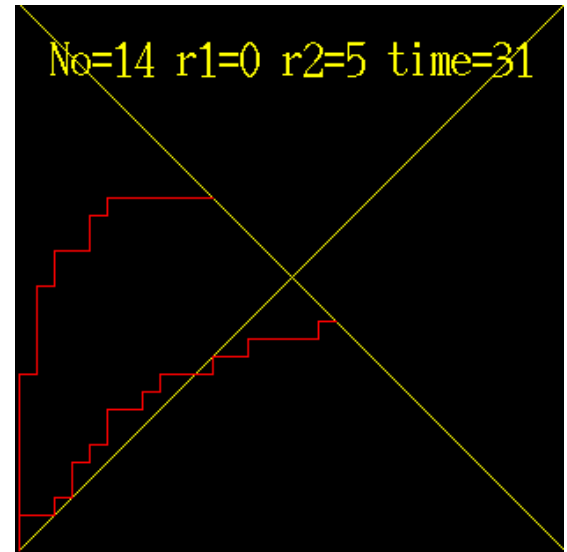
$$r = 1$$



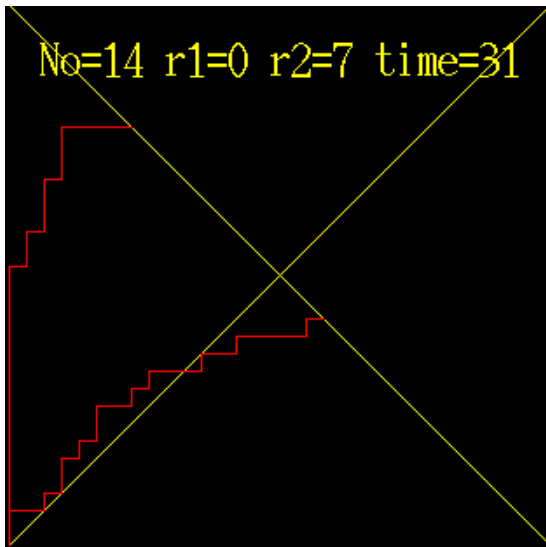
$$r = 3$$



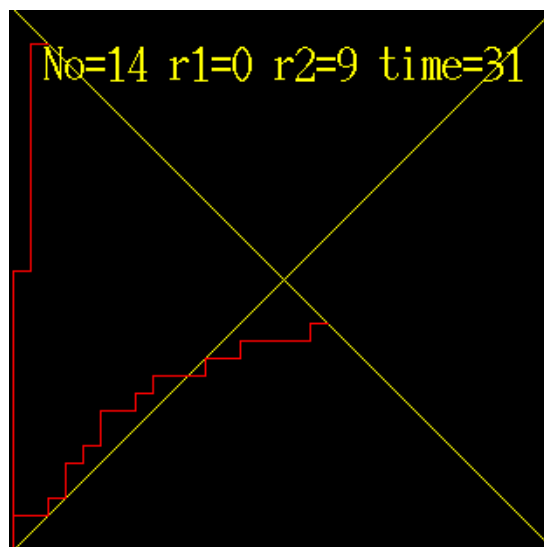
$$r = 5$$



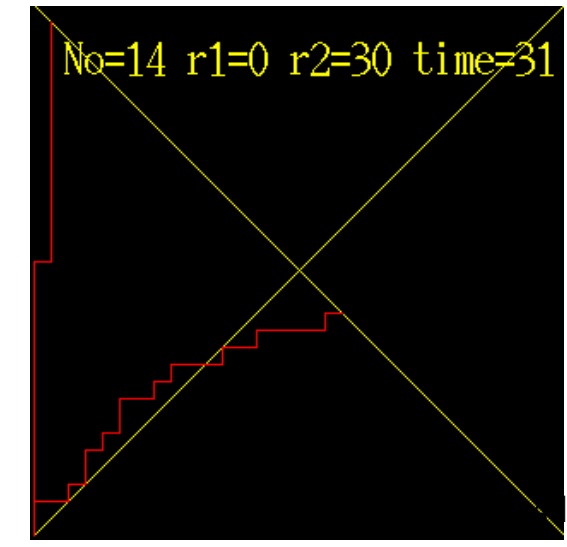
$$r = 7$$



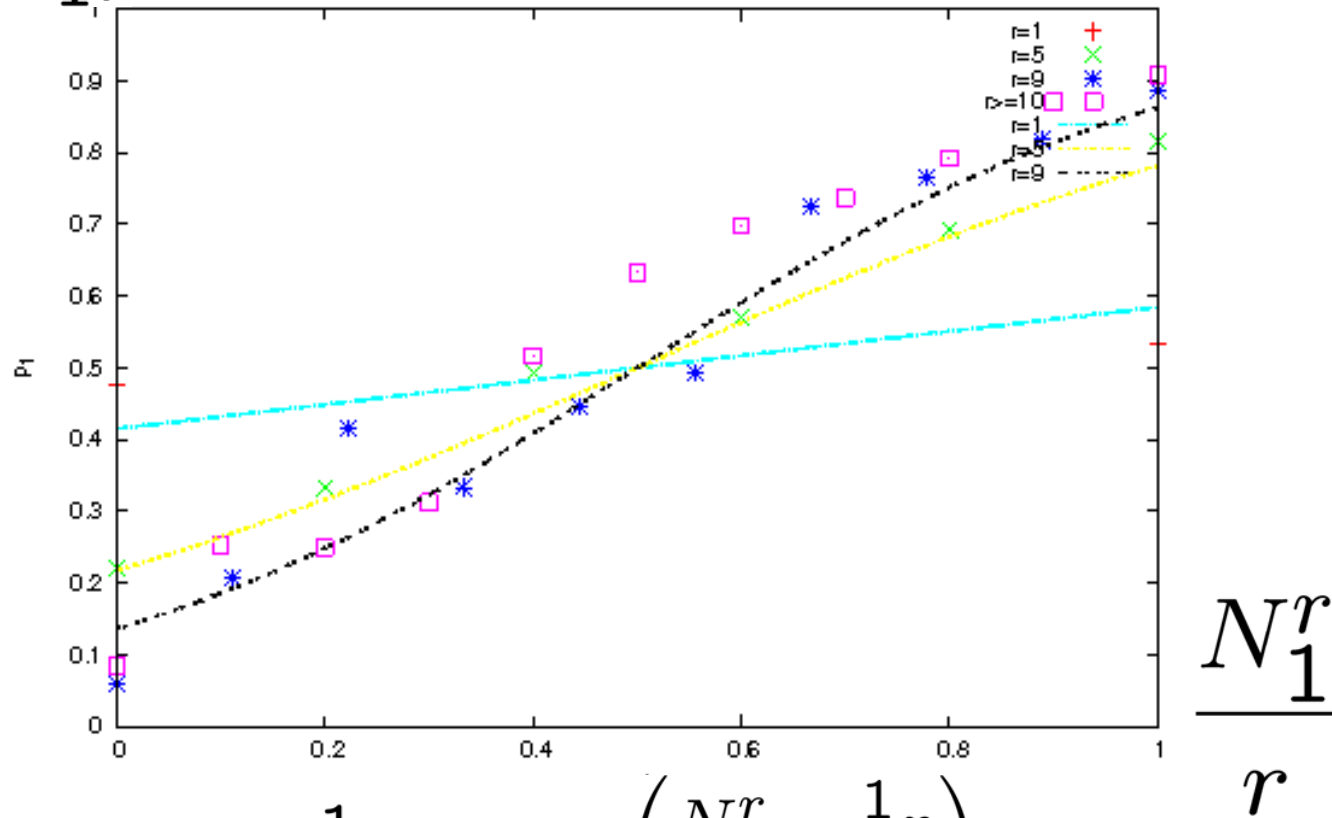
$$r = 9$$



$$r = \infty$$



$$p_1(r, N_1^r)$$

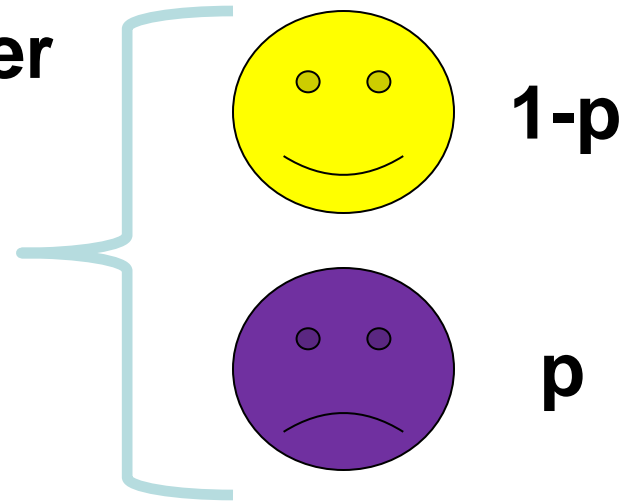
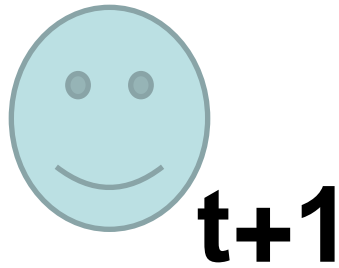


$$p_1(r, N_1^r) = \frac{1}{2} \left(\tanh \lambda \left(\frac{N_1^r - \frac{1}{2}r}{r + z} \right) + 1 \right)$$

$$\lambda_{MLE} = 4.15, \quad 3.57 \leq \lambda \leq 4.92 (95\% \text{Conf.})$$

$$z_{MLE} = 11.21, \quad 8.72 \leq z \leq 14.64 (95\% \text{Conf.})$$

Voting Model with General Herder



$$(1 - p) + p \cdot p_1(r, N_1^r)$$

$$p \cdot p_1(r, N_0^r)$$

Truth

$$N_1^r(t)$$

False

$$N_0^r(t)$$

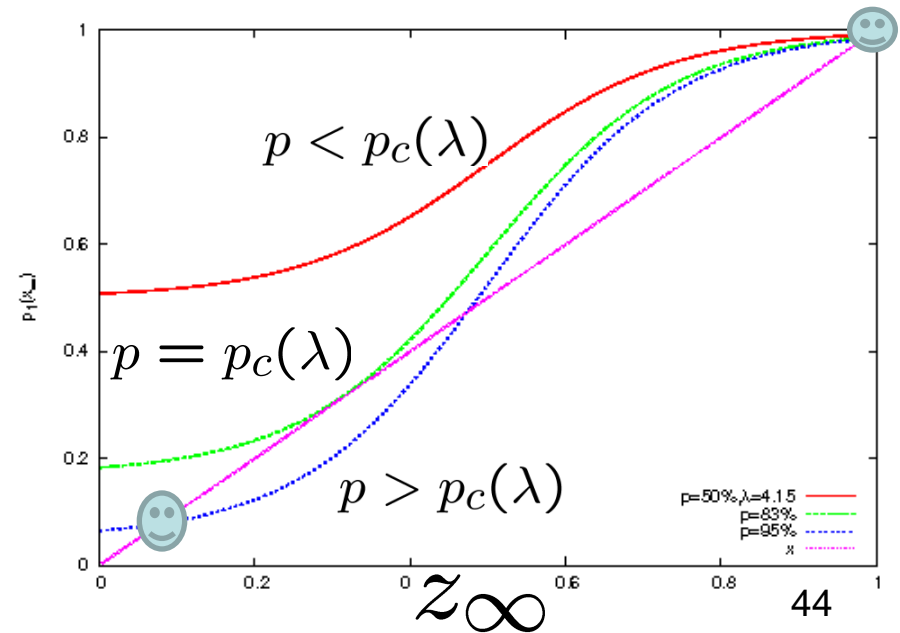
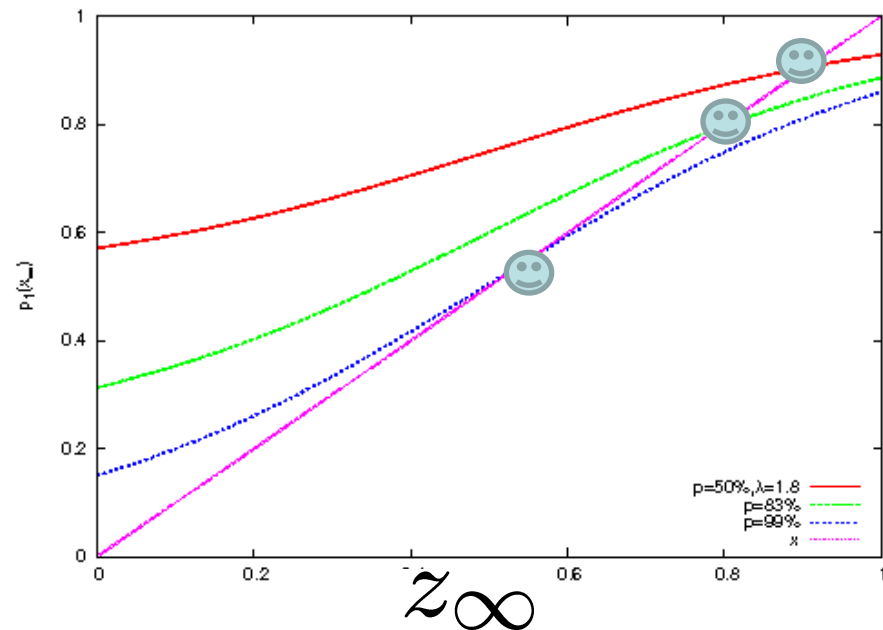
Mean Field Eq. $r = \infty, t \rightarrow \infty$

$$\lim_{t \rightarrow \infty} \frac{N_1^\infty(t)}{t} = z_\infty$$

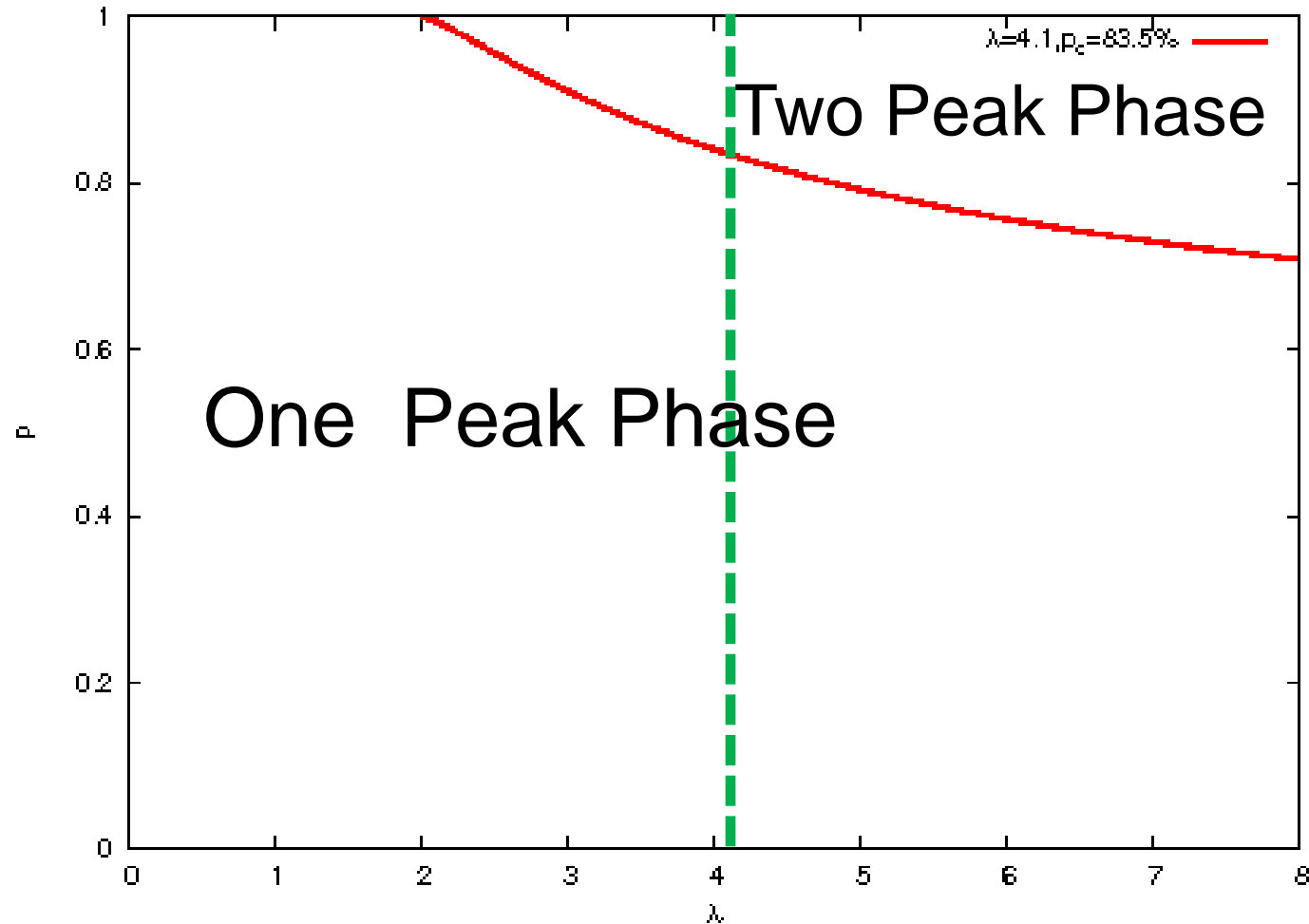
$$z_\infty = (1 - p) + p \frac{1}{2} (\tanh \lambda (z_\infty - \frac{1}{2}) + 1)$$

$$\lambda < \lambda_c = 2$$

$$\lambda > \lambda_c = 2$$

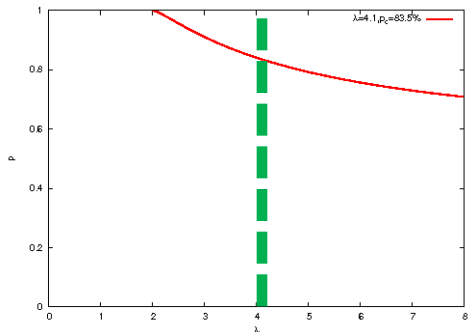
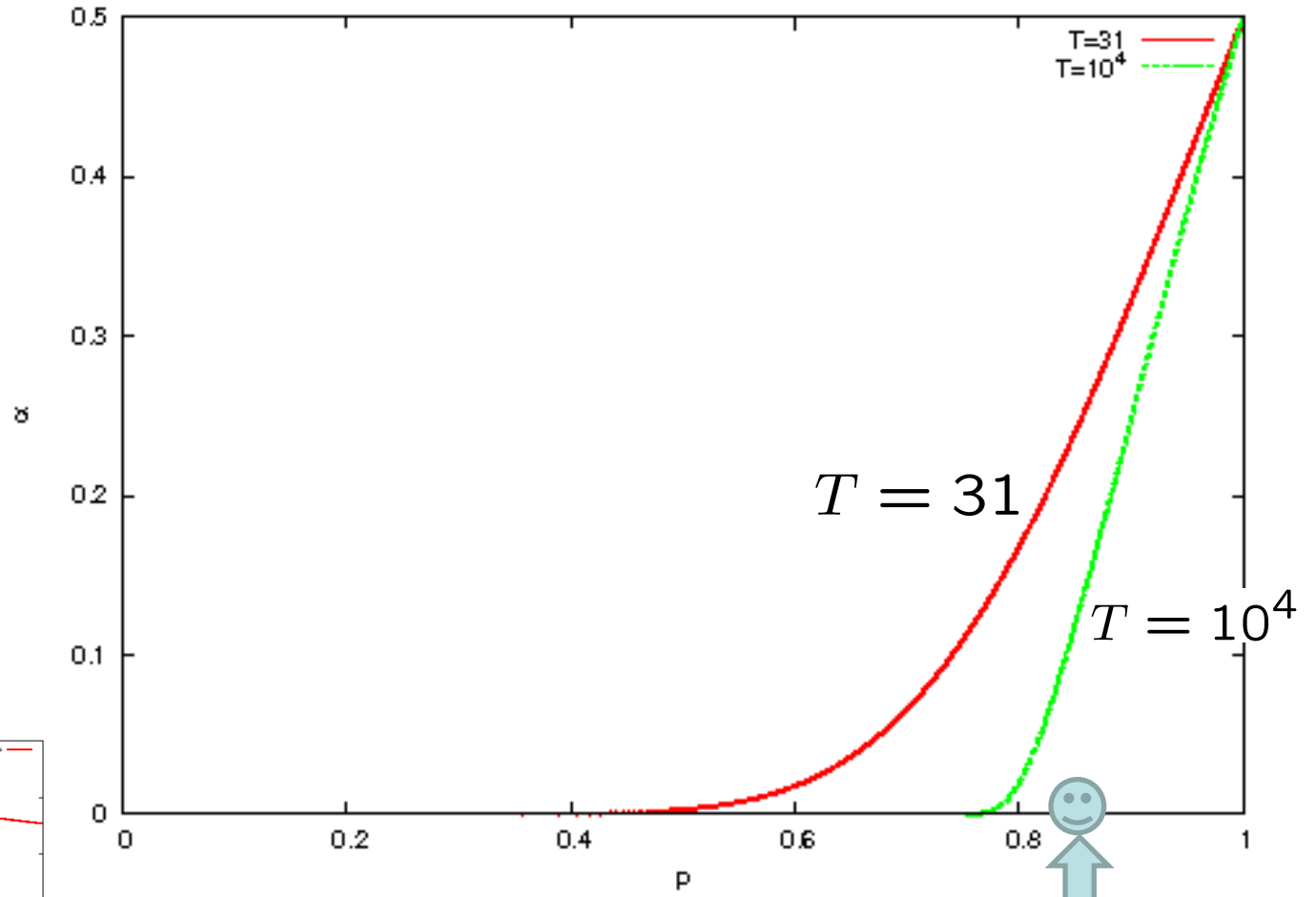


Phase Diagram



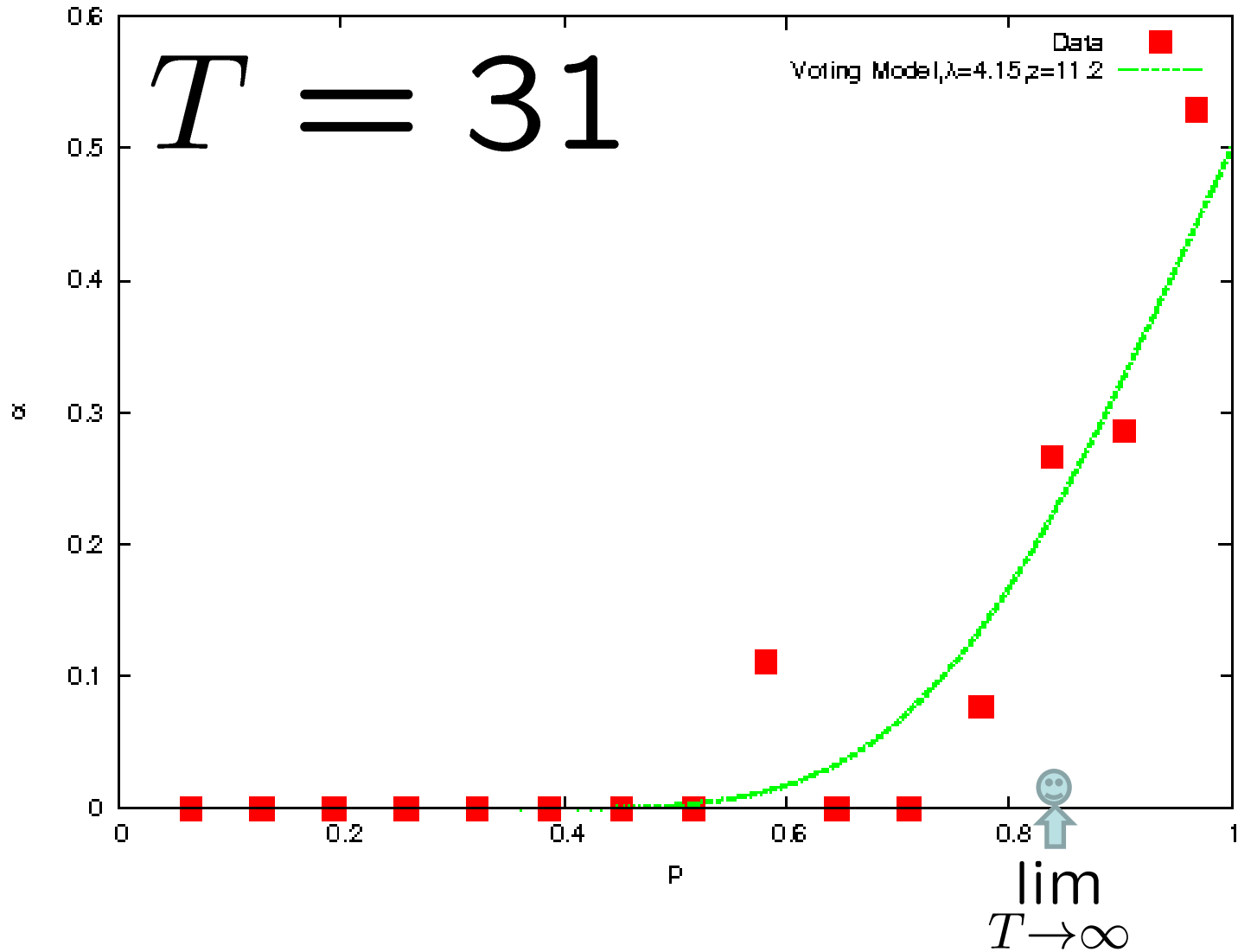
$$\lambda_{MLE} = 4.15$$

$\alpha = \text{Prob. (All } \textcircled{\text{sad face}} \text{ } p\% \rightarrow \text{False } \textcircled{\text{horse}} \text{)}$



lim
 $T \rightarrow \infty$ 46

$\alpha = \text{Prob. (All } \textcircled{\text{f}} \text{ p\% } \rightarrow \text{False)}$

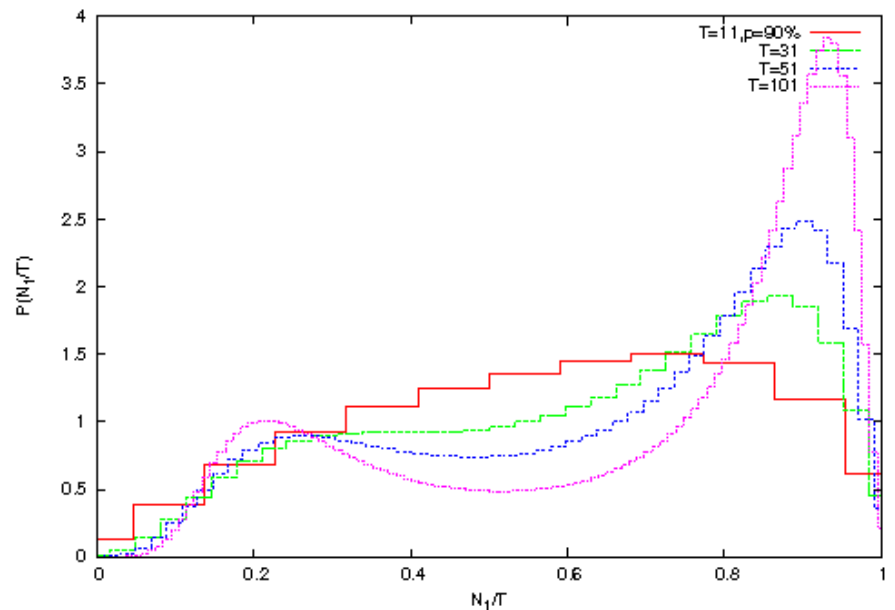
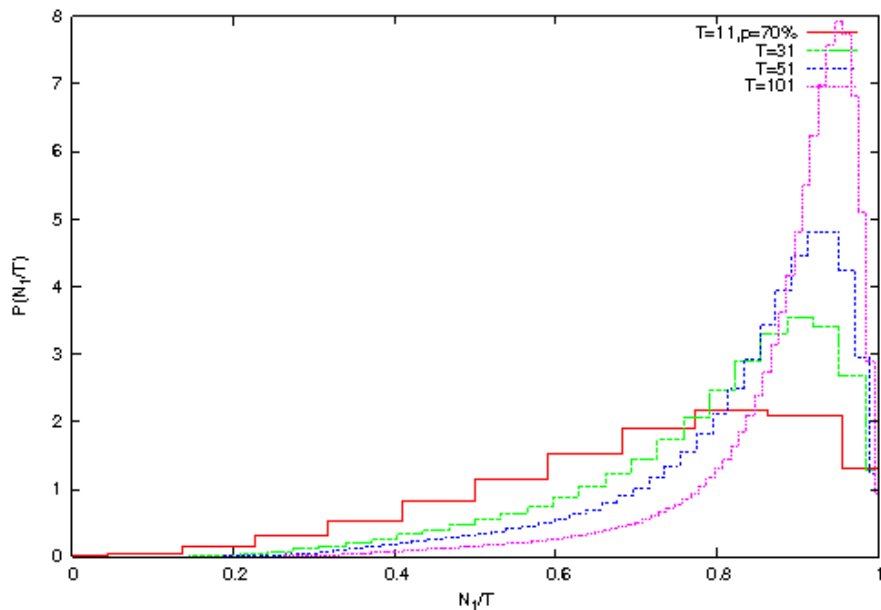


How to detect p_c

$$Z(t) = \frac{N_1^\infty(t)}{t}$$

$$p < p_c$$

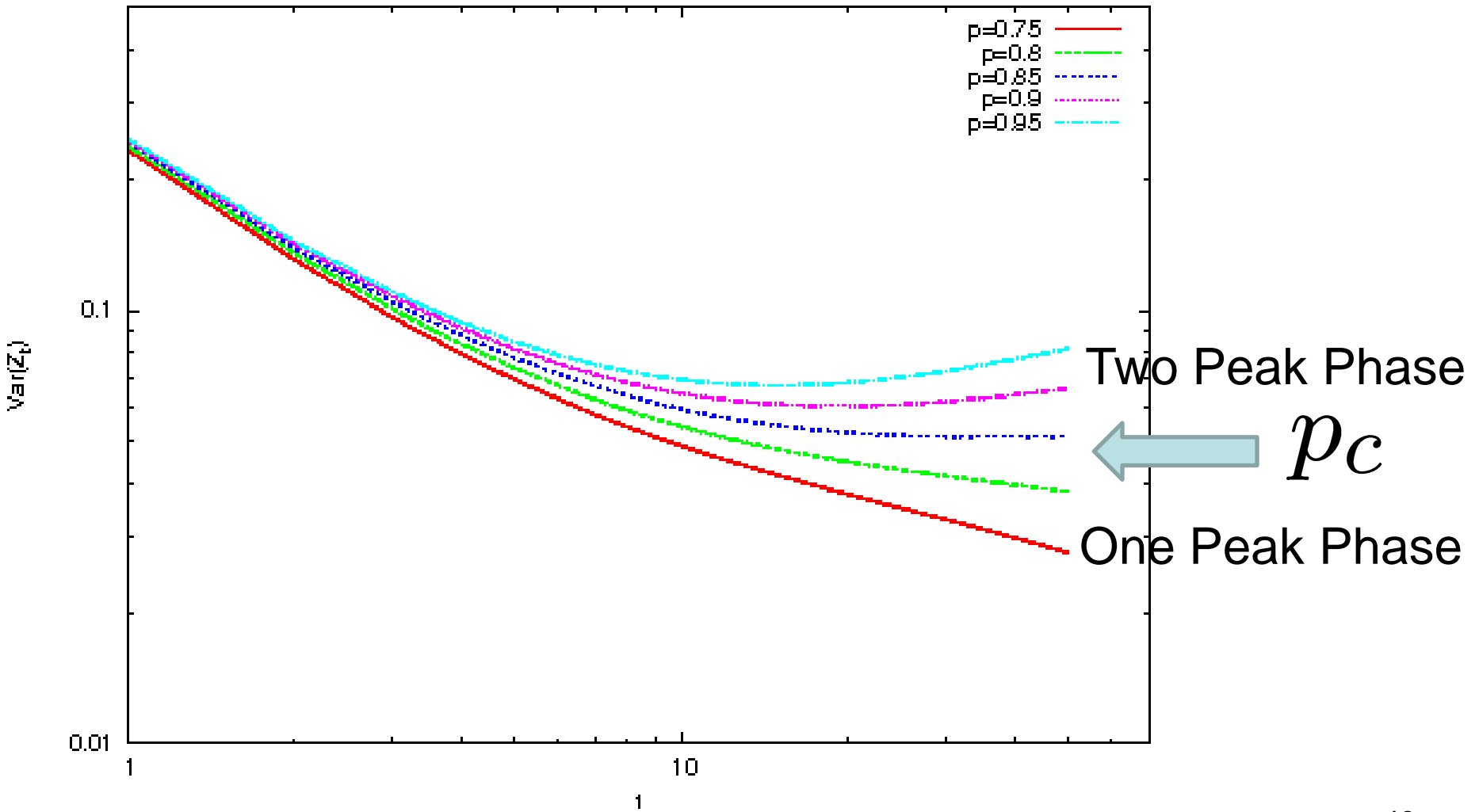
$$p > p_c$$



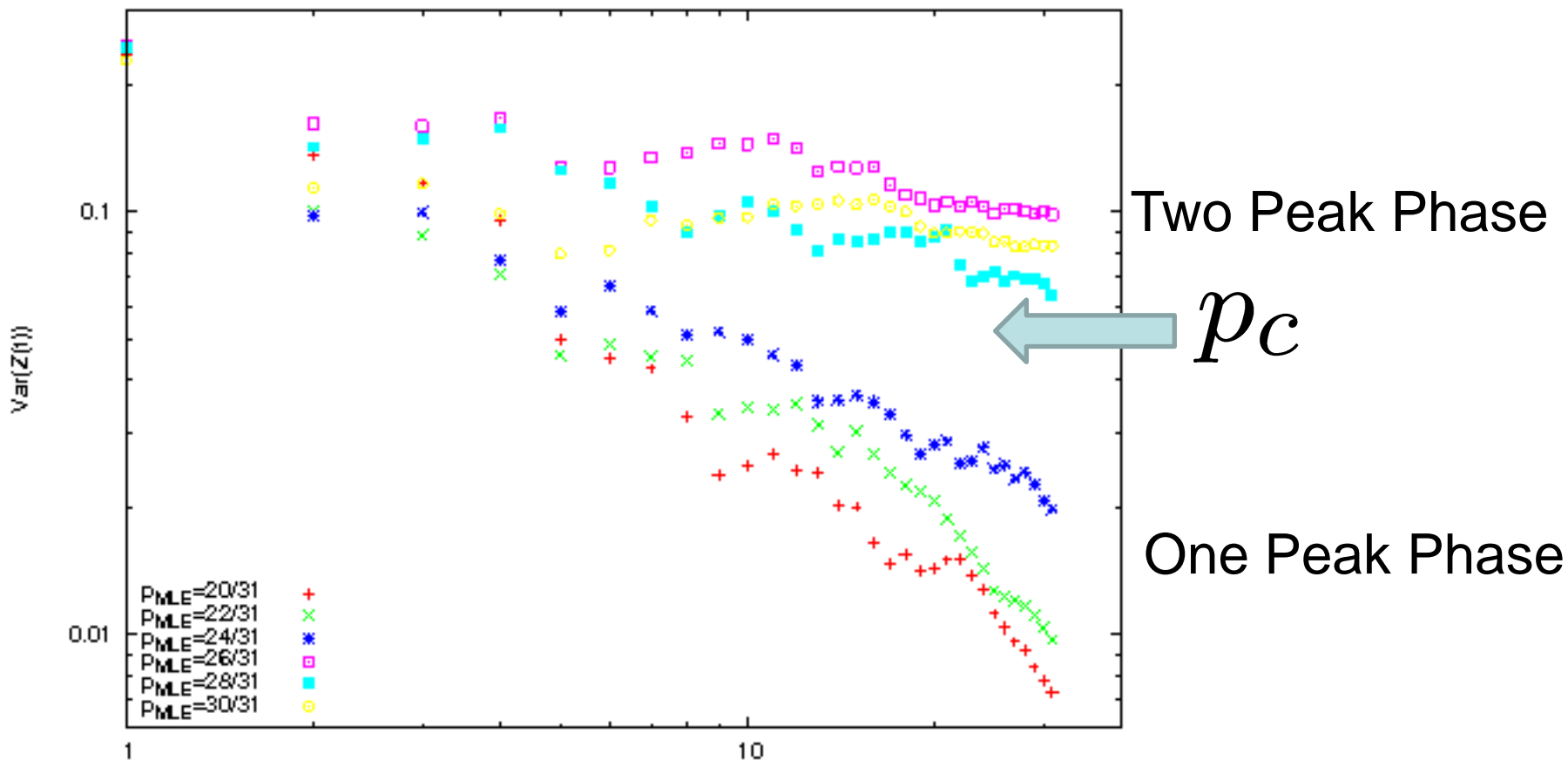
$$\lim_{T \rightarrow \infty} \text{Var}(Z(T)) \rightarrow 0$$

$$\lim_{T \rightarrow \infty} \text{Var}(Z(T)) \rightarrow c > 0$$

How to estimate p_c ?



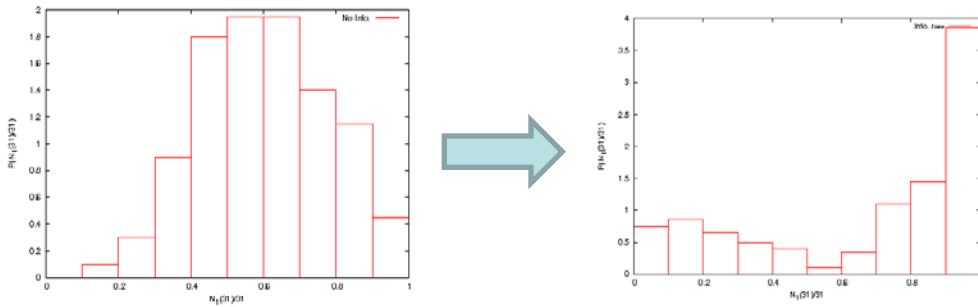
Phase Transition



$$p_c = \frac{26}{31} \simeq 0.84$$

Conclusions 2

The information cascade is a phase transition.



t+1

How he votes ?

$$p_1(r, N_1^r) = \frac{1}{2} \left(\tanh \lambda \left(\frac{N_1^r - \frac{1}{2}r}{r + z} \right) + 1 \right)$$

$$\lambda_{MLE} = 4.15, \quad 3.57 \leq \lambda \leq 4.92 (95\% \text{ Conf.})$$

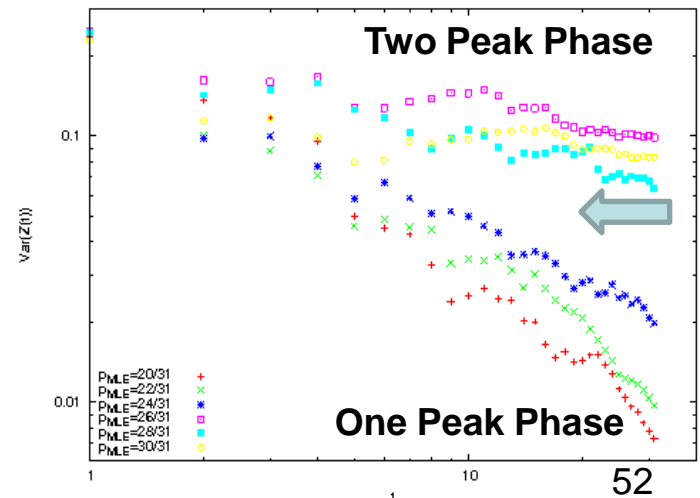
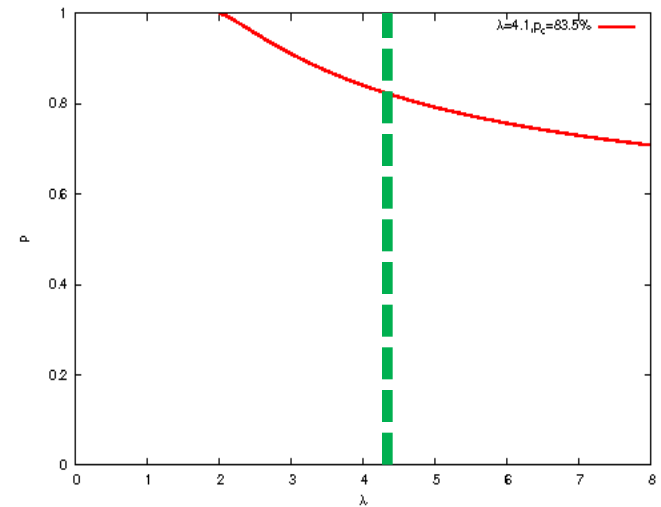
$$z_{MLE} = 11.21, \quad 8.72 \leq z \leq 14.64 (95\% \text{ Conf.})$$

$$p_c = 0.835 \simeq \frac{26}{31}$$

Mean Field

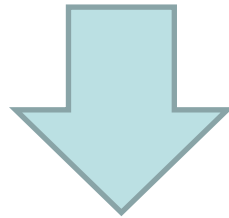
Exp.

Phase Diagram



$$p_c \simeq 80\%$$

$$p > p_c$$



$$\Pr(\text{Majority}=\text{False}) = \alpha > 0$$

Thank you !