## Likelihood Function: Binomial/Bernoulli

- Samples x(1),... x(1000) where r purchase milk
- Assuming conditional independence, likelihood function is

$$L(\theta \mid x(1),...,x(1000)) = \prod_{i} \theta^{x(i)} (1-\theta)^{n-x(i)} = \theta^{r} (1-\theta)^{1000-r}$$

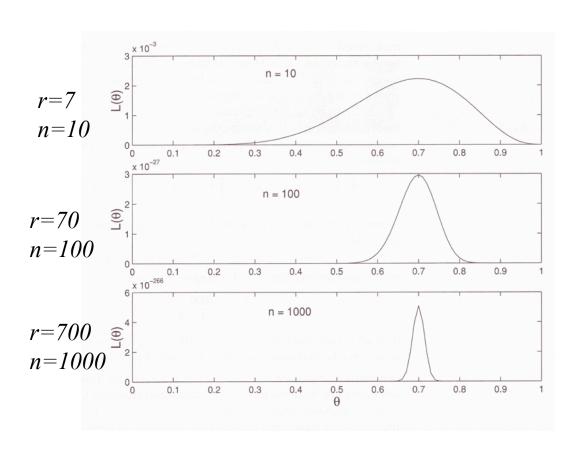
- Binomial pdf includes every possible way of getting r successes so it has  ${}^{n}C_{r}$  additive terms
- Log-likelihood Function

$$l(\theta) = \log L(\theta) = r \log \theta + (1000 - r) \log(1 - \theta)$$

• Differentiating and setting equal to zero  $\hat{\theta}_{ML} = r/1000$ 

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## Binomial: Likelihood Functions



Likelihood function for three data sets

## Binomial distribution

*r* milk purchases out of *n* customers

 $\theta$  is the probability that milk is purchased by random customer

Uncertainty becomes smaller as n increases