## Lognormal Distribution

- $\log (\mathrm{X})$ normal (natural $\log$ )
- Equivalently: $\mathrm{X}=\mathrm{e}^{\mathrm{Y}}$ where Y normal
- X must be $\geq 0$
- "Shifted lognormal": $\log (\mathrm{X}+\mathrm{c})$ normal
- Equivalently: $\mathrm{X}=\mathrm{e}^{\mathrm{Y}}$ - c where Y normal


## Multiplicative Central Limit Theorem

- Under fairly broad circumstances, the product of independent random variable is lognormal.
- Proof: Take logs and use CLT

Random Variables Modeled by Lognormal Distributions

- Concentrations of pollutants
- Sensitivity of individuals to a chemical compound
- Survival times after diagnosis of cancer
- Abundance of plants, fish, birds and insects in ecology
- Income of employed persons


## Examples of Models Using the Multiplicative CLT

- Concentration of pollutants: result of successive dilutions.
- The amount of a toxic substance reaching a baby through mother's milk: the result of many multiplicative processes.
- The degree of deterioration of an engineered process: the result of numerous defects that have a proportional effect.

