

## CHAPTER 1

Atoms  
Molecules  $\longrightarrow$  Thermodynamics

Statistical Thermodynamics (S.T.)

S.T. is the key to understanding driving forces.  
e.g., determines if a process proceeds spontaneously.

Let's start with entropy  
probabilities are important for understanding entropy

Suppose there are different outcomes (A, B, C, ...) for some event

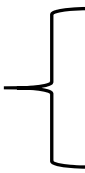
$$p_A = \frac{n_A}{N}$$

$\longleftarrow$  # of outcomes giving A  
 $\longleftarrow$  total # of outcomes

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Prob of outcome A:  $0 \leq p_A \leq 1$

prob of getting 4 when rolling a die =  $1/6$

Now consider 3 rolls   $\left\{ \begin{array}{l} \text{prob of 3, 3, 4, in that order?} \\ \text{prob of rolling two 3's, 4 in} \\ \text{any order?} \end{array} \right.$

- **mutually exclusive:** e.g., if A occurs, B does not
- **collectively exhaustive:**  $A_1, A_2, \dots, A_t$  give all possible outcomes
- **independent:**  $A_1, A_2, A_3 \dots$  independent if outcome of each is unrelated to outcome of others
- **multiplicity:** total # of ways different outcomes can be realized

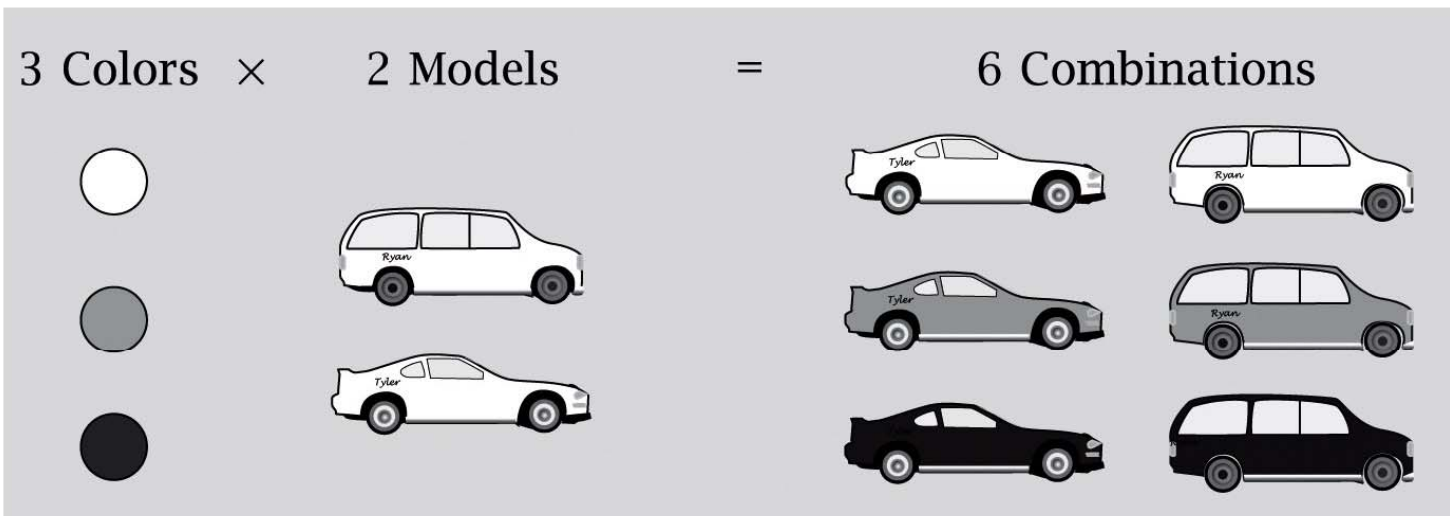


Figure 1.1 Molecular Driving Forces 2/e (© Garland Science 2011)

$n_A = \# \text{ of outcomes of A}$	2 models
$n_B = \# \text{ of outcomes of B}$	<u>3 colors</u>
$W = n_A n_B = \text{multiplicity}$	6 different outcomes

## Addition Rule

if outcome A, B, ... are mutually exclusive and occur with probabilities  $p_A = \frac{n_A}{N}, p_B = \frac{n_B}{N}, \dots$

prob of seeing A or B:  $p(A \text{ or } B) = p_A + p_B$

$n_A, n_B, \dots$  are statistical weights

if outcomes  $n_A, n_B, \dots, n_E$  are collectively exhaustive and mutually exclusive

$$n_A + n_B + \dots + n_E = N$$

$$p_A + p_B + \dots + p_E = 1$$

## Multiplication Rule

If outcomes A, B, ..., E are independent

prob of seeing A and B and ... E

$$p(\text{A and B and ... E}) = p_A p_B \dots p_E$$

### Examples

Rolling a die

$$\text{prob of 1 or 4} = 1/6 + 1/6 = 1/3$$

Roll die twice

$$\text{prob of 1 and then 4} = 1/6 \bullet 1/6 = 1/36$$

prob of five heads in a row in coin flips

$$(1/2)^5 = 1/32$$

prob of two heads, one tails, two heads on successive coin flips

$$P_H^2 P_t P_H^2 = 1/32 \quad \text{one of 32 possible sequences}$$

## Independent events $p_A, p_B$

prob that both happen =  $p_A p_B$

prob A happens, B does not =  $p_A(1-p_B)$

prob neither happens =  $(1-p_A)(1-p_B)$

prob that something happens (A or B or Both)

$$= 1 - \text{prob}(\text{not A and not B}) = 1 - (1-p_A)(1-p_B) = p_A + p_B - p_A p_B$$

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prob of 1 on first roll of die and 4 on 2<sup>nd</sup> roll =  $1/36$

prob of 1 on first roll or 4 on 2<sup>nd</sup> roll = ?

(1, 1)*	(1, 2)*	(1, 3)*	(1, 4)*	(1, 5)*	(1, 6)*
(2, 1)	(2, 2)	(2, 3)	(2, 4)*	(2, 5)	(2, 6)
(3, 1)	(3, 2)	(3, 3)	(3, 4)*	(3, 5)	(3, 6)
(4, 1)	(4, 2)	(4, 3)	(4, 4)*	(4, 5)	(4, 6)
(5, 1)	(5, 2)	(5, 3)	(5, 4)*	(5, 5)	(5, 6)
(6, 1)	(6, 2)	(6, 3)	(6, 4)*	(6, 5)	(6, 6)

prob =  $11/36$  – By  
counting all possibilities

Not a viable approach in  
general

class A	1 and anything but 4:	5/36
class B	anything but 1 and 4:	5/36
class C	1 and 4:	1/36
	$p(1 \text{ or } 4) =$	<hr style="width: 100px; margin-left: auto; margin-right: 0;"/> 11/36

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Another approach is the following:

$$\text{prob}(1) = 6/36$$

$$\text{prob}(4) = 6/36$$

$$\text{prob}(1 \text{ and } 4) = 1/36$$

$$\text{prob}(1 \text{ or } 4) = 6/36 + 6/36 - 1/36 = 11/36$$


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Essentially all questions can be reexpressed in terms of a combination of and and or operations.

Here is a third approach to the above problem

$$p(\text{fail}) = p(\text{not } 1 \text{ first}) \text{ and } p(\text{not } 4 \text{ second})$$

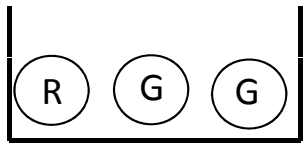
$$= 5/6 \cdot 5/6 = 25/36$$

$$p(\text{success}) = 1 - p(\text{fail}) = 11/36$$

## Correlated Events

outcome of an event depends on the outcomes of other events

Example: Balls from barrel with replacement



prob of G =  $2/3$  on 1<sup>st</sup> try; prob of R =  $1/3$  on 1<sup>st</sup> try  
 probabilities on second try depends on whether ball  
 put back after first try

one red and two  
 green balls in a  
 barrel

if put back  $\longrightarrow$  uncorrelated  
 if not put back  $\longrightarrow$  correlated

If one does not return balls to the barrel, the three possible sequences are:

Move # $\longrightarrow$	3	2	1	
	G	G	R	$1 \cdot 1 \cdot 1/3 = 1/3$
	G	R	G	$1 \cdot 1/2 \cdot 2/3 = 2/6$
	R	G	G	$1 \cdot 1/2 \cdot 2/3 = 2/6$

**Note:** We have to  
 renormalize on moves  
 after the 1<sup>st</sup>

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$\Sigma$  all possibilities = 1



“Gambling Eq.”

5 horses A, B, C, D, E

prob of winning  $p_A, p_B, p_C, p_D, p_E$  (e.g., odds from Las Vegas)

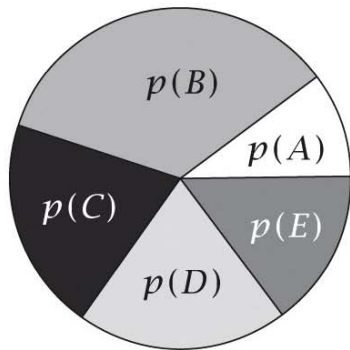
Suppose C wins, what are probabilities for A, B, D, E to come in second?

prob  $p_C$  is first,  $p_A$  is second,  $p_B$  is third

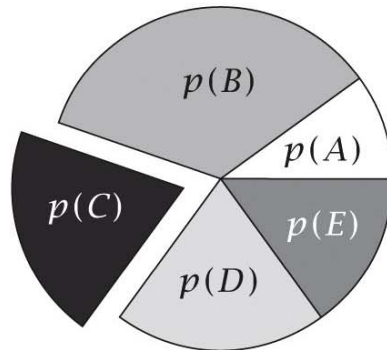
$$p_A(2^{nd}, C \text{ first}) = \frac{p_A}{p_A + p_B + p_D + p_E} = \frac{p_A}{1 - p_C}, \text{ etc.}$$

$$p_C \left( \frac{p_A}{1 - p_C} \right) \left( \frac{p_B}{1 - p_C - p_A} \right) = \frac{p_A p_B p_C}{(1 - p_C)(1 - p_C - p_A)}$$

(a) Who will win?



(b) Given that C won...



(c) Who will place second?

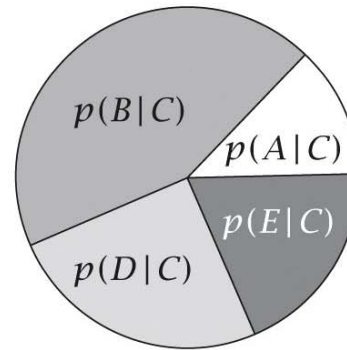


Figure 1.2 Molecular Driving Forces 2/e (© Garland Science 2011)

Combinatorics: Composition rather than sequence of events is important

Consider coin tosses

prob of seeing HTHH? → a sequence question

prob of seeing 3H1T regardless of order → a composition question

prob of 3H, 1T

16 total arrangements from 4H, 3H1T, 2H2T, 1H3T, 4T

The number of ways of getting 3H, 1T is 4  
(so prob =  $4/16 = 1/4$ )

We will show that the answer is given by  $\frac{4!}{3!1!} = 4$

Consider letters x, y, z, w

4 possibilities at first draw

3 possibilities at 2<sup>nd</sup> draw

2 possibilities at 3<sup>rd</sup> draw

1 possibility at 4<sup>th</sup> draw

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4! = 24 sequences

letters of alphabet: 26! sequences

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Distinguishable and indistinguishable

$\frac{\text{letters}}{3 \text{ distinguishable arrangements}}$   $AHA$  vs.  $\frac{A_1HA_2}{3! = 6 \text{ arrangements}}$

$\frac{3!}{2!} = 3$  ← accounts for the fact we cannot distinguish the two As.

In general, the # of permutations is

$$W = \frac{N!}{n_1!n_2!\dots n_t!} \quad \left\{ \begin{array}{l} n_1 \text{ indistinguishable members of 1} \\ n_2 \text{ indistinguishable members of 2} \\ \dots \\ n_t \text{ indistinguishable members of } t \end{array} \right.$$

When there are only two categories,  $n_1$  and  $n_2$

$$W = \frac{N!}{n_1!n_2!} = \frac{N!}{n_1!(N-n_1)!} = \binom{N}{n_1}$$

So for the 3HT coin flip example

$$\# \text{ of distinguishable arrangements } = \frac{4!}{3!1!} = 4$$

flip a coin 117 times

How many arrangements have 36 heads?

$$W = \frac{117!}{36!81!} = 1.84 \times 10^{30}$$

### 6 coin tosses

$$6H \quad 6!/6!0! = 1$$

$$5H1T \quad 6!/5!1! = 6$$

$$4H2T \quad 6!/4!2! = 15$$

$$3H3T \quad 6!/3!3! = 20$$

$$2H4T \quad = 15$$

$$1H5T \quad = 6$$

$$0H6T \quad = 1$$

← most probable situation is  
equal # heads and tails

Roll die 15 times: How many ways can we achieve  
three 1, one 2, one 3, five 4, two 5, three 6

$$\frac{15!}{3!1!1!5!2!3!} = 151,351,200 \text{ sequences}$$

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prob of royal flush in poker

Ace, King, Queen, Jack, 10 of same suit 52 cards

$$4 \left[ \frac{5}{52} \cdot \frac{4}{51} \cdot \frac{3}{50} \cdot \frac{2}{49} \cdot \frac{1}{48} \right] = 1.53 \times 10^{-6} \text{ probability}$$

the factor of  
4 accounts for  
the four suits

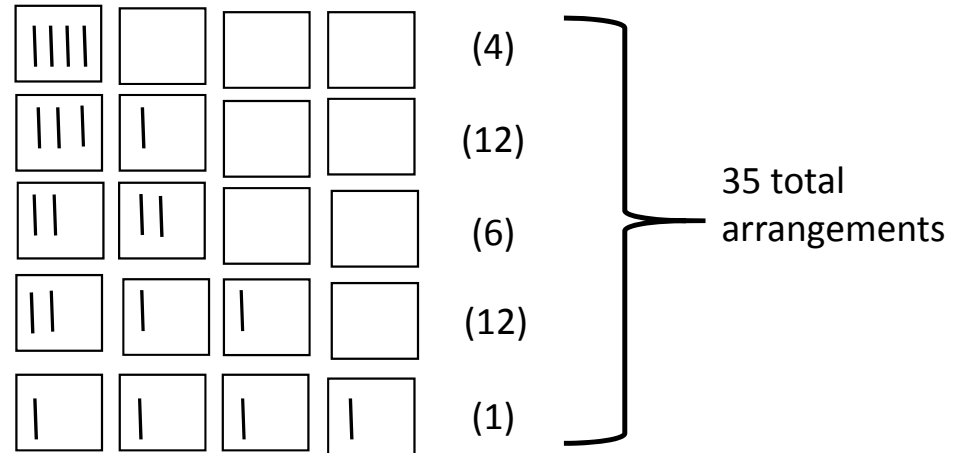
## Bose-Einstein statistics

# ways  $n$  indistinguishable particles can be put in  $M$  boxes with no constraint on # in a box

$$W(n, M) = \frac{(M + n - 1)!}{(M - 1)!n!} \quad \left| \quad \begin{array}{l} \text{rather than } m \\ \text{boxes consider} \\ M - 1 \text{ walls} \end{array} \right.$$

to check: 4 particles in 4 boxes

$$W(4, 4) = \frac{7!}{3!4!} = 35$$



# Distribution functions

- discrete
- continuous

In general, probability distributions should be normalized

given  $g(x)$  on interval  $[a, b]$

If discrete  $\sum_{i=1}^t p(i) = 1$

$$g_o = \int_a^b g(x) dx$$

$$p(x) = \frac{g(x)}{g_o}$$

**Note:**  $\int_a^b p(x) dx = 1$

Normalized, as advertised

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## Binomial and multinomial distributions

Binomial: two outcomes (e.g., heads, tails)

$$p_1 \quad p_2 = 1 - p_1 \quad \left| \quad \text{coin toss } p_H = p_T = \frac{1}{2}$$

all combinations of two events

$$\begin{aligned} p_1^2 + p_1 p_2 + p_2 p_1 + p_2^2 &= p_1^2 + (1 - p_1) + (1 - p_1) p_1 + (1 - p_1)^2 \\ &= p_1^2 + p_1 - p_1^2 + p_1 - p_1^2 + 1 - 2p_1 + p_1^2 = 1 \end{aligned}$$

$$p(n, N) = p^n (1-p)^{N-n} \cdot \frac{N!}{n!(N-n)!} = \left( \begin{array}{l} \text{prob of one event} \\ \text{regardless of order} \end{array} \right) \binom{\#}{\text{sequences}}$$

$\frac{N!}{n!(N-n)!}$	}	$N=0$	$p(0,0) = 1$	}
		$N=1$	$= \frac{1!}{0!1!} = 1$	
			$= \frac{1!}{1!0!} = 1$	
		$N=2$	$= \frac{2!}{0!2!} = 1$	
			$= \frac{2!}{1!1!} = 2$	
			$= \frac{2!}{2!0!} = 1$	

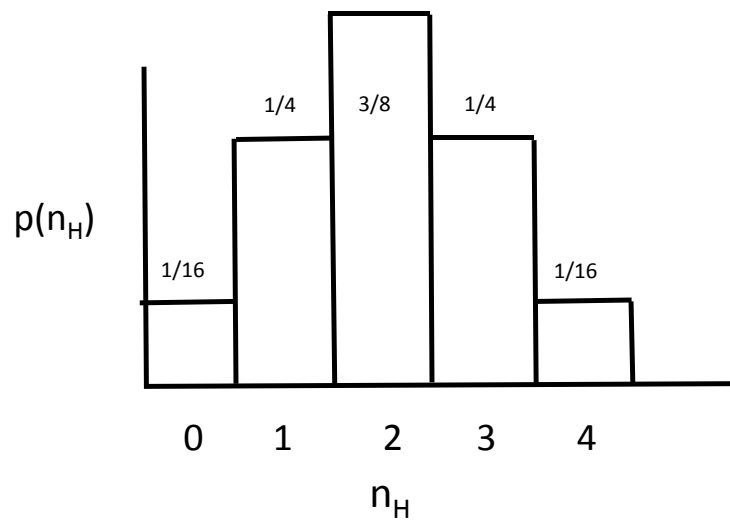
$N=0$			1				
$N=1$			1	1			
$N=2$			1	2	1		
$N=3$			1	3	3	1	
$N=4$			1	4	6	4	1

} Pascal's triangle



2 coins  $HH$   $pp(1-p)^0 = 1/4$   
 $HT$   $p(1-p) = 1/2(1/2) = 1/4$   
 $TT$   $p^0(1-p)^2 = 1/4$

3 coins  $HHH$   $p^3(1-p)^0 = 1/8$   
 $HHT$   $= (1/2)^2(1/2) = 1/8$  Etc.



Multinomial prob distrib :  $p_1^{n_1} p_2^{n_2} \dots p_t^{n_t} \frac{N!}{n_1! n_2! \dots n_t!}$   $\left( \sum_i n_i = N \right)$

## Averages

If continuous:

$$\langle x^n \rangle = \int_a^b x^n p(x) dx = n^{\text{th}} \text{moment}$$

$$\langle f(x) \rangle = \int_a^b f(x) p(x) dx$$

If discrete:  $\langle i \rangle = \sum_{i=1}^t ip(i)$

$$\langle f(i) \rangle = \sum_{i=1}^t f(i) p(i)$$

assuming the distribution is normalized

$\langle x \rangle$  = mean, or average

$$g = \int_a^b p(x) dx$$

$$p' = p(x) / g$$

This converts  
p(x) to a  
normalized  
distribution p'(x)

average of 3, 3, 2, 2, 2, 1, 1

$$\langle i \rangle = \frac{\text{sum of numbers}}{\# \text{ of samples}} = \frac{14}{7} = 2$$

$$p_1 = \frac{2}{7}, p_2 = \frac{3}{7}, p_3 = \frac{3}{7} \quad \langle i \rangle = 1\left(\frac{2}{7}\right) + 2\left(\frac{3}{7}\right) + 3\left(\frac{2}{7}\right)$$
$$= \frac{2+6+6}{7} = 2$$

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Variance ( $\sigma^2$ ) = width of distribution

$$\sigma^2 = \langle (x-a)^2 \rangle = \langle x^2 - 2ax + a^2 \rangle; \quad \langle x \rangle = a = \text{mean}$$
$$= \langle x^2 \rangle - 2a\langle x \rangle + a^2$$
$$= \langle x^2 \rangle - a^2 = \langle x^2 \rangle - \langle x \rangle^2$$

$$\sigma = \sqrt{\sigma^2} \quad \text{standard deviation}$$

If do four coin flips many times  
what will you find for the average # of heads (obviously 2)

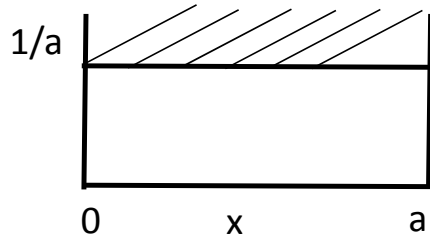
How to compute this mathematically

$$\begin{aligned}\langle n_H \rangle &= \sum_{n_H=0}^4 n_H P(n_H, N) \\ &= 0 \binom{4}{16} + 1 \binom{4}{16} + 2 \binom{6}{16} + 3 \binom{4}{16} + 4 \binom{1}{16} \\ &= \frac{4+12+12+4}{6} = 2\end{aligned}$$

$$\langle n_H^2 \rangle = 5 \quad \langle n_H^2 \rangle - \langle n_H \rangle^2 = 5 - 2^2 = 1 \quad \sigma^2 = 1$$

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Uniform distribution



$$\langle x \rangle = \frac{a}{2} \quad \langle x^2 \rangle = \frac{a^2}{3}$$

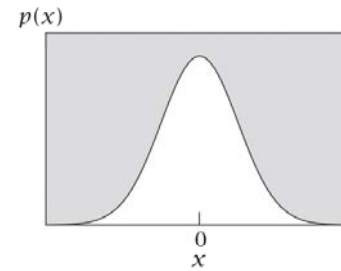
$$\langle x^2 \rangle - \langle x \rangle^2 = \frac{a^2}{12}$$

Exponential distribution  $g_o = \int_0^\infty e^{-ax} dx = \frac{1}{a}$

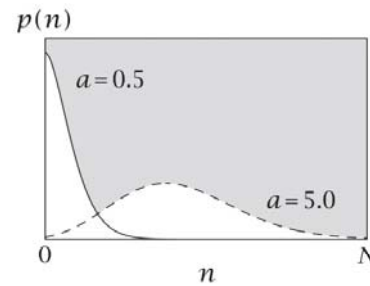
$p(x) = ae^{-x}, \quad 0 \leq x \leq \infty$        $\langle x \rangle = a \int_0^\infty xe^{-ax} dx = \frac{1}{a}$

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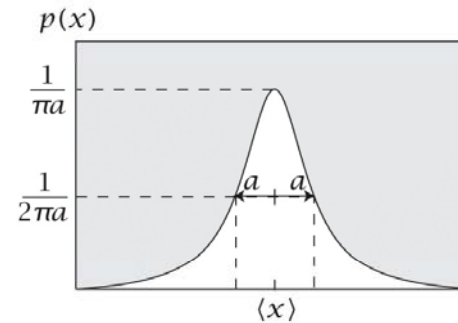
Gaussian  $p(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-x^2/2\sigma^2} \quad -\infty \leq x \leq \infty$



Poisson  $p(n) = \frac{a^n e^{-a}}{n!}$



Lorentzian  $p(x) = \frac{1}{\pi} \frac{a}{(x - \langle x \rangle)^2 + a^2} \quad -\infty \leq x \leq \infty$



Power law  $p(x) = \frac{1}{x^q}, \quad q \text{ is a constant}, \quad -\infty \leq x \leq \infty$