MADS-MMS – Mathematics and Multivariate Statistics

Powers and Logarithms

Prof. Dr. Stephan Doerfel





Moodle (SoSe 2025)

This chapter is largely repeating (hopefully) known mathematics. We will therefore only very quickly go through the first sections on powers, roots, and logarithms and focus more on the applications.

Use Exercises 1–3 as homework, to test yourself and to (re-)familiarize yourself with the notions.

Agenda

Motivation

Powers

Roots

Logarithms

Applications

Scaling Diagrams Logarithms in Python Numeric Stability

Outline

Motivation

Powers

Roots

Logarithms

Applications
Scaling Diagrams
Logarithms in Python
Numeric Stability

recall basic notions on powers, roots, and logarithms

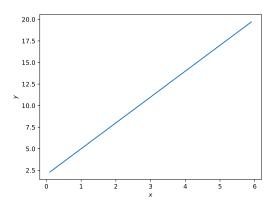
- recall basic notions on powers, roots, and logarithms
- ▶ prepare for their use in many ML algorithms (a.o. probabilistic learning, deep learning!)

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- ▶ prepare for their use in many ML algorithms (a.o. probabilistic learning, deep learning!)
- awareness of non-linear nature of many phenomena
- ▶ visualization and pitfalls using logarithms

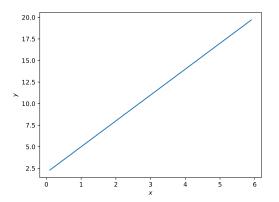
Relations Between Two Quantities 1/3

When we think of relations between two quantities x and y, we often subconsciously imagine it like this:



Relations Between Two Quantities 1/3

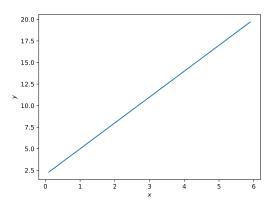
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Relations Between Two Quantities 1/3

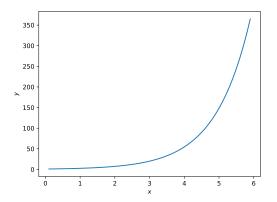
When we think of relations between two quantities x and y, we often subconsciously imagine it like this:



- ▶ we usually think in linear relationships
- \triangleright a change of x has a proportionally large effect on y

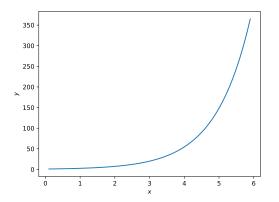
Relations Between Two Quantities 2/3

Often, relationships look completely different, e.g. like this:



Relations Between Two Quantities 2/3

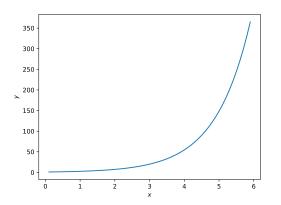
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exponential growth

Relations Between Two Quantities 2/3

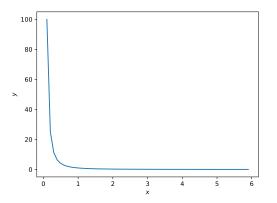
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- exponential growth
- e.g. number of subsets of a set (clustering!), information vs. bit-length, Corona infections

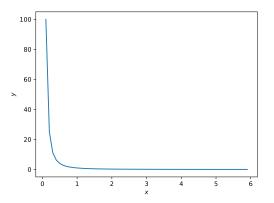
Relations Between Two Quantities 3/3

Sometimes, they look like this:



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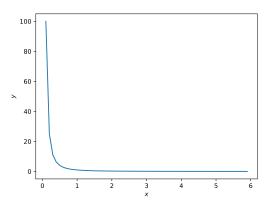
Sometimes, they look like this:



► the example shows a power law

Relations Between Two Quantities 3/3

Sometimes, they look like this:



- ► the example shows a power law
- ▶ number of activities per user (90-9-1 rule), number of responses to tweets, number of citations to articles, frequency of words in texts, . . .

Outline

Motivation

Powers

Roots

Logarithms

Applications
Scaling Diagrams
Logarithms in Python
Numeric Stability

Powers

Definition 1

Let n be a natural number and $a \in \mathbb{R}$ with a > 0, then a to the power of n

$$a^n := \prod_{i=1}^n a$$
.

a is called the base and n the exponent.

Powers 6 / 22

Powers

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$$a^n := \prod_{i=1}^n a$$
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a is called the base and n the exponent.

Examples: $a^0 = 1$

$$a^1 = a$$

$$a^2 = a \cdot a$$

$$a^3 = a \cdot a \cdot a$$

Powers 6 / 22

Powers – Examples

$$2^2 = 2 \cdot 2 = 4$$
 $2^{10} = 1024$ $2^0 = 1$ $1^n = 1$ for $n \in \mathbb{N}$ $7^5 = 16,807$

Powers 7 / 22

Powers - Examples

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Observation:

$$2^6 = 2 \cdot 2 \cdot 2 \cdot 2 \cdot 2 \cdot 2 = 64,$$

 $2^4 = 2 \cdot 2 \cdot 2 \cdot 2 = 16,$
 $2^2 = 2 \cdot 2 = 4$

$$2^{6-4} = 2^2 = 4$$
 and $\frac{2^6}{2^4} = \frac{64}{16} = 4$

Powers 7 / 22

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 and $\frac{2^6}{2^4} = \frac{64}{16} = 4$

This is a result of a general rule, and gives rise to defining powers for negative exponents.

Powers 7 / 22

Adding / Subtracting Exponents

Definition 2

Let *n* be a natural number and $a \in \mathbb{R}$ with a > 0, then

$$a^{-n} := \frac{1}{a^n}$$

Powers 8 / 22

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$$2^{-2} = \frac{1}{2^2} = \frac{1}{4}$$

 $2^{-10} = \frac{1}{1024}$

Powers 8 / 22

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Examples:
$$2^{-2} = \frac{1}{2^2} = \frac{1}{4}$$

 $2^{-10} = \frac{1}{1024}$

Theorem 3

Let n, m be integers and $a \in \mathbb{R}$ with a > 0, then

$$a^{m+n} = a^m \cdot a^n$$
 and $a^{m-n} = \frac{a^m}{a^n}$

Powers 8 / 22

Products / Quotients in the Base

Observation

$$(2 \cdot 3)^3 = \prod_{i=1}^3 (2 \cdot 3) = \prod_{i=1}^3 2 \cdot \prod_{i=1}^3 3 = 2^3 \cdot 3^3$$

Powers 9 / 22

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9 / 22

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This is again an example of a general law:

Theorem 4

Let n be an integer and a, $b \in \mathbb{R}$ with a, b > 0, then

$$(a \cdot b)^n = a^n \cdot b^n$$
 and $(\frac{a}{b})^n = \frac{a^n}{b^n}$

Powers 9 / 22

Outline

Motivation

Powers

Roots

Logarithms

Applications
Scaling Diagrams
Logarithms in Python
Numeric Stability

Reverse Operation – Root

$$a^n = b$$

Given b and n, what is the value of a?

Roots 10 / 22

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Definition 5

Let n be an integer and $a, b \in \mathbb{R}$ with a, b > 0, then a is the n-th root of b, denoted

$$\sqrt[n]{b} := a \iff a^n = b$$

Roots 10 / 22

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Examples:

$$\sqrt[3]{4} = 2$$
 $\sqrt[3]{9} = 3$ $\sqrt[2]{2.25} = 1.5$ $\sqrt[3]{8} = 2$

Roots 10 / 22

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$$\sqrt[3]{8} = 2$$

Observation

$$\sqrt[3]{2^6} = \sqrt[3]{64} = 4 = 2^2 = 2^{\frac{6}{3}}$$

This is again an example of a general law.

Roots 10 / 22

Products and Quotient Exponents

Definition 6

Let *n* be a natural number and $a \in \mathbb{R}$ with a > 0, then

$$a^{\frac{1}{n}} := \sqrt[n]{a}$$

Roots 11 / 22

Products and Quotient Exponents

Definition 6

Let n be a natural number and $a \in \mathbb{R}$ with a > 0, then

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$$4^{\frac{1}{2}} = 2$$
 $9^{\frac{1}{2}} = 3$ $2.25^{\frac{1}{2}} = 1.5$ $8^{\frac{1}{3}} = 2$

Roots 11 / 22

Products and Quotient Exponents

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$$a^{\frac{1}{n}} := \sqrt[n]{a}$$

$$4^{\frac{1}{2}} = 2$$
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Theorem 7

Let $a \in \mathbb{R}$ and a > 0. Let $n, m \in \mathbb{N}$. Then

$$a^{\frac{m}{n}} = \sqrt[n]{a^m} = (\sqrt[n]{a})^m$$
 and $(a^n)^m = a^{n \cdot m}$

Roots 11 / 22

Extension of Definition and Exponent Rules

The previous definitions and laws also work for exponents in \mathbb{R} . Exceptions occur when

Roots 12 / 22

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Roots 12 / 22

Extension of Definition and Exponent Rules

The previous definitions and laws also work for exponents in $\ensuremath{\mathbb{R}}.$ Exceptions occur when

- ▶ base and exponent are zero: 0⁰ cannot be defined smoothly
- ▶ when the base is negative: $(-1)^2 = 1^2 = 1$, thus, both 1 and -1 are square roots of 1.

Roots 12 / 22

Outline

Motivation

Powers

Roots

Logarithms

Applications
Scaling Diagrams
Logarithms in Python
Numeric Stability

Reverse Operation Logarithm

$$a^c = b$$

Given a and b, what is the value of c?

Logarithms 13 / 22

Reverse Operation Logarithm

$$a^c = b$$

Given a and b, what is the value of c?

Definition 8

Let $a, b, c \in \mathbb{R}$ with a, b > 0, then c is the logarithm of b to base a:

$$\log_a b = c$$

Examples:

$$\log_2 4 = 2$$

$$\log_3 9 = 2$$

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$$og_2 8 = 3$$

Logarithms 13 / 22

Logarithm Rules 1/2

The rules for calculating powers can be transformed into rules for calculating logarithms.

$$a^{m+n} = a^m \cdot a^n$$
 and $a^{m-n} = \frac{a^m}{a^n}$

$$\log_a b + \log_a c = \log_a (b \cdot c)$$
 and $\log_a b - \log_a c = \log_a \frac{b}{c}$

Logarithms 14 / 22

Logarithm Rules 2/2

$$(a^n)^m = a^{n \cdot m}$$

 \rightarrow

$$\log_a(b^c) = c \cdot \log_a b$$

and for $c \neq 1$

$$\log_c b = \frac{\log_a b}{\log_a c}$$

Logarithms 15 / 22

Logarithm Rules 2/2

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Logarithms 15 / 22

Outline

Motivation

Powers

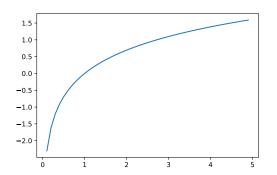
Roots

Logarithms

Applications

Scaling Diagrams Logarithms in Python Numeric Stability

Logarithm function



- ▶ defined on $\mathbb{R}_{>0}$
- ▶ goes quickly to $-\infty$ ($x \to 0$) and slowly to ∞ ($x \to \infty$)

Applications 16 / 22

Agenda

Motivation

Powers

Roots

Logarithms

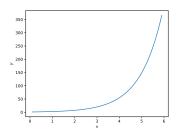
Applications

Scaling Diagrams

Logarithms in Pythor Numeric Stability

Importance of log: Exponential \rightarrow linear 1/2

Remember?

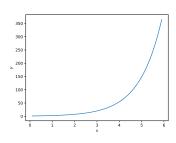


$$y = e^{x}$$

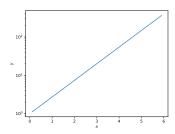
Applications Scaling Diagrams 17 / 22

Importance of log: Exponential \rightarrow linear 1/2

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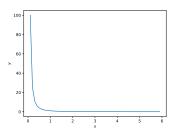


 $\log_e y = \log_e e^x = x$

Applications Scaling Diagrams 17 / 22

Importance of log: Exponential \rightarrow linear 2/2

Remember?

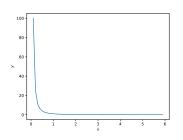


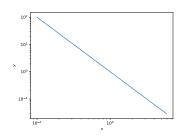
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Applications Scaling Diagrams 18 / 22

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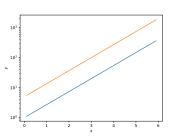


$$y = x^{-2}$$

$$\log_e y = \log_e x^{-2} = -2 \cdot \log_e x$$

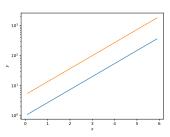
Applications Scaling Diagrams 18 / 22

Scaling Visuals



Applications Scaling Diagrams 19 / 22

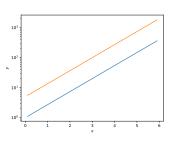
Scaling Visuals



Scaling in diagrams never changes the actual relationship.

Applications Scaling Diagrams 19 / 22

Scaling Visuals



Scaling in diagrams never changes the actual relationship.

In the diagram (with logarithmic scaling on the y axis) the space between the two lines is constant. The actual difference between the quantities (y_1 and y_2) in the unscaled data

- \triangleright are small for x near 0
- get bigger with bigger x (it grows exponentially)

$$y_1 = e^x$$
 and $y_2 = 5e^x$ $\Rightarrow y_2 - y_1 = 5e^x - e^x = 4e^x$

Applications Scaling Diagrams 19 / 22

Agenda

Motivation

Powers

Roots

Logarithms

Applications

Logarithms in Python
Numeric Stability

Implemented in module math or numpy

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▶ log(b,a) computes $log_a b$

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- ► log(b,a) computes log_a b
- ▶ log(b) computes the natural logarithm $log_e b$, where e is Euler's number.

Implemented in module math or numpy

- ► log(b,a) computes log_a b
- ▶ log(b) computes the **natural logarithm** *logeb*, where *e* is Euler's number.
- ► the difference between the packages is that the numpy logarithm works with arrays, applying the logarithm componentwise (to each element of the array separately)



A Simple Model of Epidemic Spreading



Exercises 5

Agenda

Motivation

Powers

Roots

Logarithms

Applications

Scaling Diagrams Logarithms in Python

Numeric Stability

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- multiplying many small numbers can yield zero even for very small rounding errors, overflows and underflows can occur

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Computing the logarithm of the product instead

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Notebook 03 1 numeric stability