

Branching Networks I

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Principles of Complex Systems, Vols. 1, 2, & 3D
CSYS/MATH 6701, 6713, & a pretend number, 2024–2025

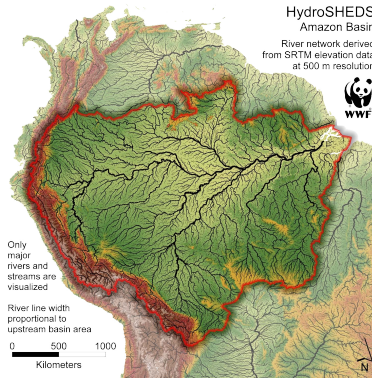
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Branching networks are everywhere ...



<http://hydrosheds.cr.usgs.gov/>

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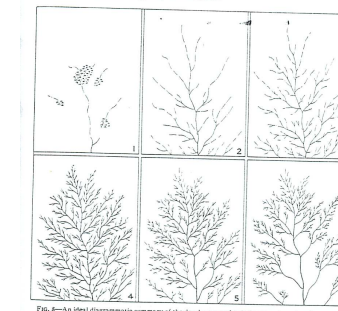


Fig. 8—An ideal diagrammatic summary of the development of a drainage system areas for increases of complexity only. The first four parts show extension, that is: 1, initiation; 2, elongation; 3, elaboration and 4, maximum extension. Parts 5 and 6 represent steps during integration.

The sequential stages recognized in the evolution of a drainage system are “extension” and “integration”; the first, a stage of increasing complexity; the second, of simplification.

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Branching networks are everywhere ...



<http://en.wikipedia.org/wiki/Image:Applebox.JPG>

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Geomorphological networks

Definitions

- Drainage basin** for a point p is the complete region of land from which overland flow drains through p .
- Definition most sensible for a point in a stream.
- Recursive structure**: Basins contain basins and so on.
- In principle, a drainage basin is defined at every point on a landscape.
- On flat hillslopes, drainage basins are effectively linear.
- We treat subsurface and surface flow as following the gradient of the surface.
- Okay for large-scale networks ...

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Introduction

Branching networks are useful things:

- Fundamental to material **supply and collection**
- Supply**: From one source to many sinks in 2- or 3-d.
- Collection**: From many sources to one sink in 2- or 3-d.
- Typically observe hierarchical, recursive self-similar structure

Examples:

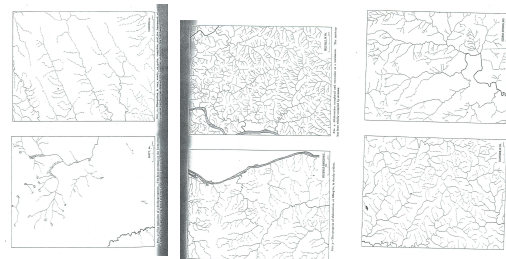
- River networks (our focus)
- Cardiovascular networks
- Plants
- Evolutionary trees
- Organizations (only in theory ...)

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An early thought piece: Extension and Integration



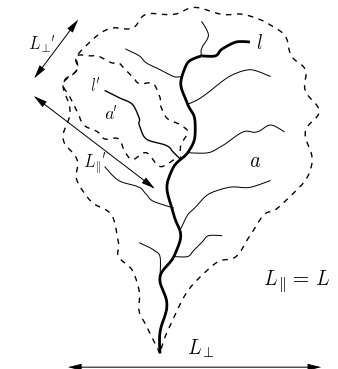
“The Development of Drainage Systems: A Synoptic View”
Waldo S. Glock,
The Geographical Review, **21**, 475–482, 1931. [2]



Initiation, Elongation Elaboration, Piracy. Abstraction, Absorption.

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Basic basin quantities: a , l , $L_{||}$, L_{\perp} :

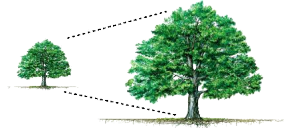


- a = drainage basin area
- l = length of longest (main) stream (which may be fractal)
- $L = L_{||}$ = longitudinal length of basin
- $L = L_{\perp}$ = width of basin

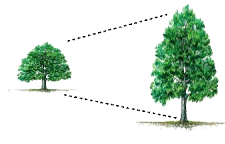
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Allometry

Isometry:
dimensions scale linearly with each other.



Allometry:
dimensions scale nonlinearly.



There are a few more 'laws': [1]

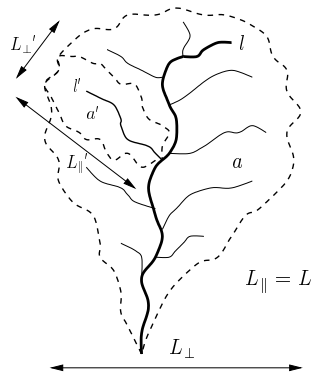
| Relation: | Name or description: |
|---|--|
| $T_k = T_1 (R_T)^{k-1}$ | Tokunaga's law |
| $\ell \sim L^d$ | self-affinity of single channels |
| $n_\omega / n_{\omega+1} = R_n$ | Horton's law of stream numbers |
| $\ell_{\omega+1} / \ell_\omega = R_\ell$ | Horton's law of main stream lengths |
| $\bar{a}_{\omega+1} / \bar{a}_\omega = R_a$ | Horton's law of basin areas |
| $\bar{s}_{\omega+1} / \bar{s}_\omega = R_s$ | Horton's law of stream segment lengths |
| $L_\perp \sim L^H$ | scaling of basin widths |
| $P(a) \sim a^{-\tau}$ | probability of basin areas |
| $P(\ell) \sim \ell^{-\gamma}$ | probability of stream lengths |
| $\ell \sim a^h$ | Hack's law |
| $a \sim L^D$ | scaling of basin areas |
| $\Lambda \sim a^\beta$ | Langbein's law |
| $\lambda \sim L^\varphi$ | variation of Langbein's law |

Stream Ordering:

Method for describing network architecture:

- Introduced by Horton (1945) [4]
- Modified by Strahler (1957) [7]
- Term: Horton-Strahler Stream Ordering [5]
- Can be seen as **iterative trimming** of a network.

Basin allometry



Allometric relationships:

- $\ell \propto a^h$
- $\ell \propto L^d$
- Combine above:
 $a \propto L^{d/h} \equiv L^D$

Reported parameter values: [1]

| Parameter: | Real networks: |
|----------------|-----------------|
| R_n | 3.0–5.0 |
| R_a | 3.0–6.0 |
| $R_\ell = R_T$ | 1.5–3.0 |
| T_1 | 1.0–1.5 |
| d | 1.1 ± 0.01 |
| D | 1.8 ± 0.1 |
| h | 0.50–0.70 |
| τ | 1.43 ± 0.05 |
| γ | 1.8 ± 0.1 |
| H | 0.75–0.80 |
| β | 0.50–0.70 |
| φ | 1.05 ± 0.05 |

Stream Ordering:

Some definitions:

- A **channel head** is a point in landscape where flow becomes focused enough to form a stream.
- A **source stream** is defined as the stream that reaches from a channel head to a junction with another stream.
- Roughly analogous to capillary vessels.
- Use symbol $\omega = 1, 2, 3, \dots$ for stream order.

'Laws'

Hack's law (1957) [3]:

$$\ell \propto a^h$$

reportedly $0.5 < h < 0.7$

Scaling of main stream length with basin size:

$$\ell \propto L_\parallel^d$$

reportedly $1.0 < d < 1.1$

Basin allometry:

$$L_\parallel \propto a^{h/d} \equiv a^{1/D}$$

$D < 2 \rightarrow$ basins elongate.

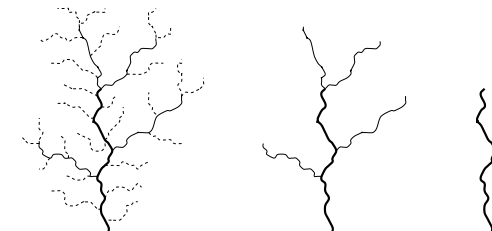
Kind of a mess ...

Order of business:

- Find out how these relationships are connected.
- Determine most fundamental description.
- Explain origins of these parameter values

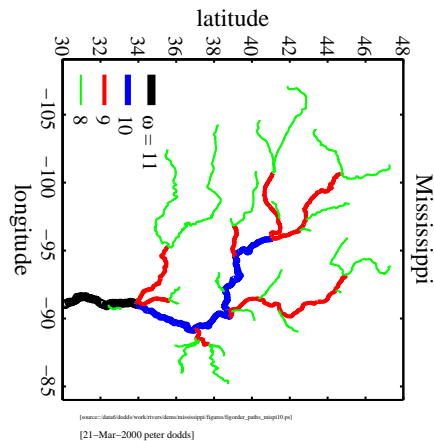
For (3): **Many attempts: not yet sorted out ...**

Stream Ordering:



- Label all **source streams** as **order $\omega = 1$** and remove.
- Label all **new** source streams as **order $\omega = 2$** and remove.
- Repeat until one stream is left (order = Ω)
- Basin is said to be of the order of the last stream removed.
- Example above is a basin of order $\Omega = 3$.

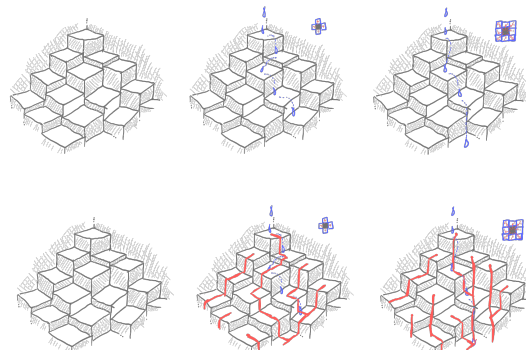
Stream Ordering—A large example:



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Basic algorithm for extracting networks from Digital Elevation Models (DEMs):



Also:
`/Users/dodds/work/rivers/1998dems/kevinlakewaster.c`

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Stream Ordering:

Resultant definitions:

- A basin of order Ω has n_ω streams (or sub-basins) of order ω .
 $n_\omega > n_{\omega+1}$
- An order ω basin has area a_ω .
- An order ω basin has a main stream length ℓ_ω .
- An order ω basin has a stream segment length s_ω
 - an order ω stream segment is only that part of the stream which is actually of order ω
 - an order ω stream segment runs from the basin outlet up to the junction of two order $\omega - 1$ streams

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Stream Ordering:

Another way to define ordering:

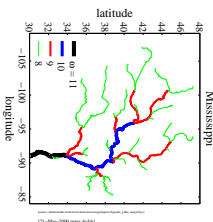
- As before, label all source streams as order $\omega = 1$.
- Follow all labelled streams downstream
- Whenever two streams of the same order (ω) meet, the resulting stream has order incremented by 1 ($\omega + 1$).

- If streams of different orders ω_1 and ω_2 meet, then the resultant stream has order equal to the largest of the two.

- Simple rule:

$$\omega_3 = \max(\omega_1, \omega_2) + \delta_{\omega_1, \omega_2}$$

where δ is the Kronecker delta.

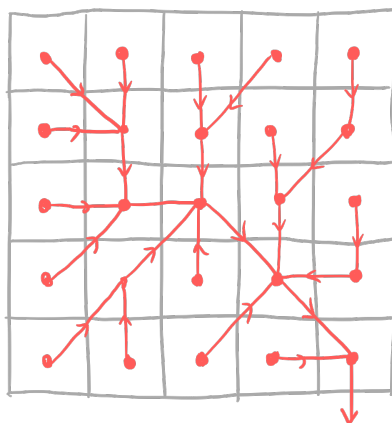


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Horton's laws

Self-similarity of river networks

- First quantified by Horton (1945)^[4], expanded by Schumm (1956)^[6]

Three laws:

- Horton's law of stream numbers:

$$n_\omega / n_{\omega+1} = R_n > 1$$

- Horton's law of stream lengths:

$$\bar{\ell}_{\omega+1} / \bar{\ell}_\omega = R_\ell > 1$$

- Horton's law of basin areas:

$$\bar{a}_{\omega+1} / \bar{a}_\omega = R_a > 1$$

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Stream Ordering:

One problem:

- Resolution of data messes with ordering
- Micro-description changes (e.g., order of a basin may increase)
- ...but relationships based on ordering appear to be robust to resolution changes.

Utility:

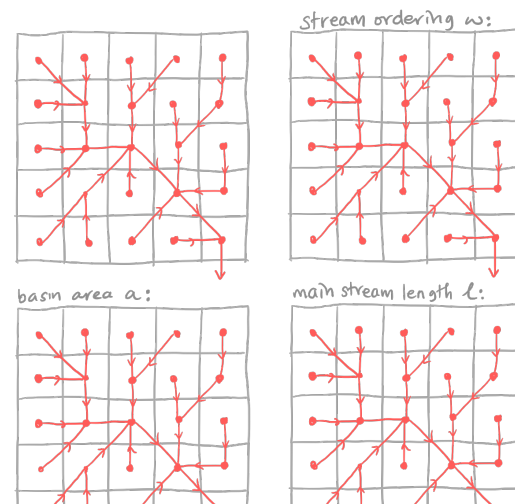
- Stream ordering helpfully discretizes a network.
- Goal: understand network architecture

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Horton's laws

Horton's Ratios:

- So ...laws are defined by three ratios:

$$R_n, R_\ell, \text{ and } R_a.$$

- Horton's laws describe exponential decay or growth:

$$\begin{aligned} n_\omega &= n_{\omega-1} / R_n \\ &= n_{\omega-2} / R_n^2 \\ &\vdots \\ &= n_1 / R_n^{\omega-1} \\ &= n_1 e^{-(\omega-1) \ln R_n} \end{aligned}$$

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Horton's laws

Similar story for area and length:

$$\bar{a}_\omega = \bar{a}_1 e^{(\omega-1)\ln R_a}$$

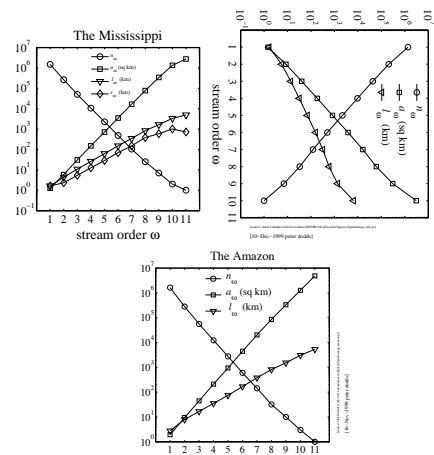
$$\bar{\ell}_\omega = \bar{\ell}_1 e^{(\omega-1)\ln R_\ell}$$

- As stream order increases, **number drops** and **area and length increase**.

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Horton's laws in the real world:



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Horton's laws

Observations:

- Horton's ratios vary:

| | |
|----------|---------|
| R_n | 3.0–5.0 |
| R_a | 3.0–6.0 |
| R_ℓ | 1.5–3.0 |

- No accepted explanation for these values.
- Horton's laws tell us how quantities vary from level to level ...
- ...but they don't explain how networks are structured.

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Horton's laws

A few more things:

- Horton's laws are laws of averages.
- Averaging for number is **across** basins.
- Averaging for stream lengths and areas is **within** basins.
- Horton's ratios go a long way to defining a branching network ...
- But we need one other piece of information ...

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Horton's laws-at-large

Blood networks:

- Horton's laws hold for sections of cardiovascular networks
- Measuring such networks is tricky and messy ...
- Vessel diameters obey an analogous Horton's law.

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Tokunaga's law

Delving deeper into network architecture:

- Tokunaga (1968) identified a clearer picture of network structure [8, 9, 10]
- As per Horton-Strahler, use **stream ordering**.
- Focus:** describe how streams of different orders connect to each other.
- Tokunaga's law is also a law of averages.

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Horton's laws

A bonus law:

- Horton's law of stream segment lengths:

$$\bar{s}_{\omega+1} / \bar{s}_\omega = R_s > 1$$

- Can show that $R_s = R_\ell$.
- Insert assignment question

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Data from real blood networks

| Network | R_n | R_r | R_ℓ | $-\frac{\ln R_n}{\ln R_n}$ | $-\frac{\ln R_\ell}{\ln R_n}$ | α |
|--------------------|-------|-------|----------|----------------------------|-------------------------------|----------|
| West <i>et al.</i> | - | - | - | 1/2 | 1/3 | 3/4 |
| rat (PAT) | 2.76 | 1.58 | 1.60 | 0.45 | 0.46 | 0.73 |
| cat (PAT) [11] | 3.67 | 1.71 | 1.78 | 0.41 | 0.44 | 0.79 |
| dog (PAT) | 3.69 | 1.67 | 1.52 | 0.39 | 0.32 | 0.90 |
| pig (LCX) | 3.57 | 1.89 | 2.20 | 0.50 | 0.62 | 0.62 |
| pig (RCA) | 3.50 | 1.81 | 2.12 | 0.47 | 0.60 | 0.65 |
| pig (LAD) | 3.51 | 1.84 | 2.02 | 0.49 | 0.56 | 0.65 |
| human (PAT) | 3.03 | 1.60 | 1.49 | 0.42 | 0.36 | 0.83 |
| human (PAT) | 3.36 | 1.56 | 1.49 | 0.37 | 0.33 | 0.94 |

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Network Architecture

Definition:

- $T_{\mu,\nu}$ = the average number of **side streams** of order ν that enter as tributaries to streams of order μ
- $\mu, \nu = 1, 2, 3, \dots$
- $\mu \geq \nu + 1$
- Recall each stream segment of order μ is 'generated' by two streams of order $\mu - 1$
- These generating streams are not considered side streams.

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Network Architecture

Tokunaga's law [8, 9, 10]

Property 1: Scale independence—depends only on difference between orders:

$$T_{\mu,\nu} = T_{\mu-\nu}$$

Property 2: Number of side streams grows exponentially with difference in orders:

$$T_{\mu,\nu} = T_1(R_T)^{\mu-\nu-1}$$

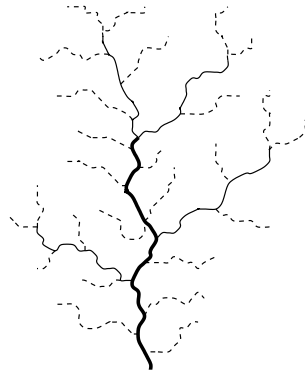
We usually write Tokunaga's law as:

$$T_k = T_1(R_T)^{k-1} \text{ where } R_T \approx 2$$

Tokunaga's law—an example:

$$T_1 \approx 2$$

$$R_T \approx 4$$



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Nutshell:

- Branching networks show remarkable **self-similarity** over many scales.
- There are many interrelated scaling laws.
- Horton-Strahler **Stream ordering** gives one useful way of getting at the architecture of branching networks.
- Horton's laws** reveal self-similarity.
- Horton's laws can be misinterpreted as suggesting a pure hierarchy.
- Tokunaga's laws** neatly describe network architecture.
- Branching networks exhibit a mixed hierarchical structure.
- Horton and Tokunaga can be connected analytically.
- Surprisingly:

$$R_n = \frac{(2 + R_T + T_1) + \sqrt{(2 + R_T + T_1)^2 - 8R_T}}{2}$$

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Crafting landscapes—Far Lands or Bust



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Erosional development of streams and their drainage basins; hydrophysical approach to quantitative morphology.
[Bulletin of the Geological Society of America, 56\(3\):275–370, 1945. pdf](#)

[5] I. Rodríguez-Iturbe and A. Rinaldo.
Fractal River Basins: Chance and Self-Organization.
Cambridge University Press, Cambridge, UK, 1997.

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The composition of drainage network in Toyohira River Basin and the valuation of Horton's first law.
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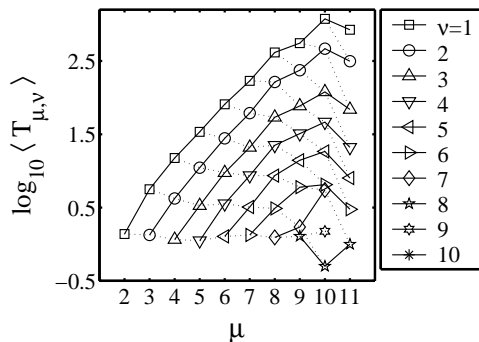
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The Mississippi

A Tokunaga graph:



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- Tokunaga's Law
- Nutshell
- References