

**Asymptotic spectra:**  
**Theory, applications and extensions**

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Strassen, in his seminal 1969 paper  
“Gaussian Elimination is Not Optimal”  
sent a clear message to the scientific  
community:

Natural, obvious and centuries-old  
methods for solving important  
computational problems may be  
far from the fastest.

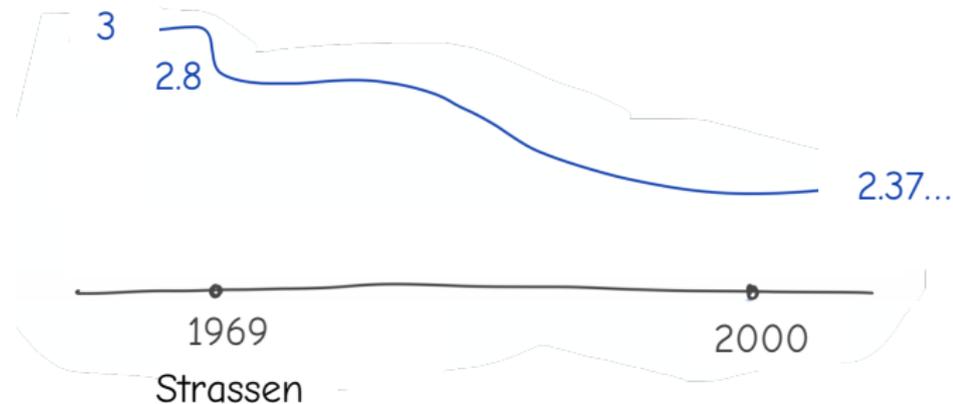
## “Gaussian elimination is not optimal”

- multiplying  $n \times n$  matrices
- inverting  $n \times n$  matrices
- solving a system of  $n$  linear equations in  $n$  unknowns
- computing the determinant of an  $n \times n$  matrix

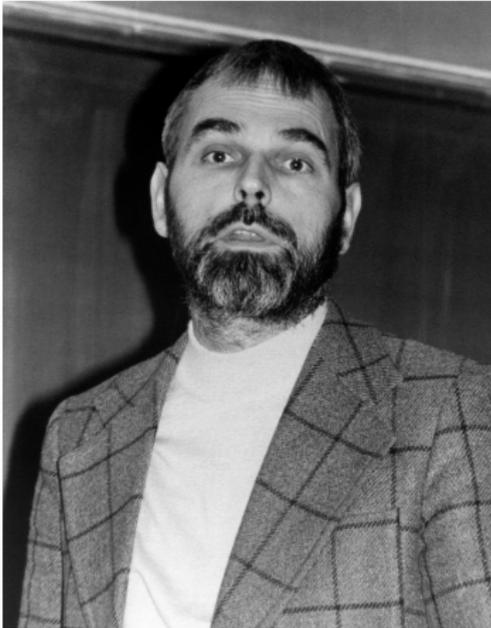
Strassen proved that the obvious  $\mathcal{O}(n^3)$  algorithm for these (equivalent) problems is **far from optimal**

by designing a new one which takes only  $\mathcal{O}(n^{2.8})$  operations

The possibility of obtaining even faster algorithms for these central problems set Strassen and many other computer scientists on a quest to obtain them, with the current record below  $O(n^{2.4})$



The quest to understand the matrix multiplication exponent  $\omega$  is still raging on.

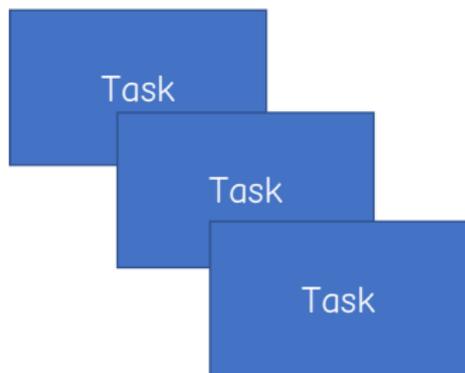


Decades later (1986–1991) Strassen developed his theory of

**Asymptotic Spectra.**

While motivated by trying to understand the complexity of matrix multiplication, this theory is far more **general**

leading to a broader framework that suits **other problems and settings.**



Central in this theory of asymptotic spectra:

What is the cost of a task if we have to perform it many times?

Arises in numerous parts of mathematics, physics, economics and computer science

- matrix multiplication
- circuit complexity (with Robert Robere)
- direct-sum problems
- Shannon capacity

Survey (with Avi Wigderson)  
[jeroenzuiddam.nl](http://jeroenzuiddam.nl)



1. Shannon capacity
2. The asymptotic spectrum of graphs
3. The asymptotic spectrum duality theorem
4. Consequences and new directions

## 1. Shannon capacity

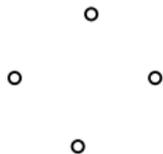
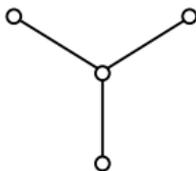
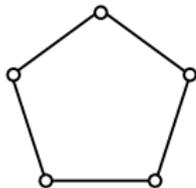
Measures **amount of information** that can be transmitted over a communication channel.

Understanding it has been an open problem in information theory and graph theory since its introduction by Shannon in 1956.

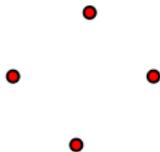
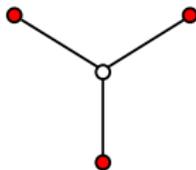
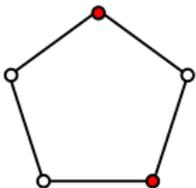
Translates to graph theoretical problem:

channel	graph
protocol	independent set
repeating	strong product

Graph



Independent set



Independence number

$$\alpha(C_5) = 2$$

$$\alpha(S_3) = 3$$

$$\alpha(E_4) = 4$$

## Strong product

$$G \boxtimes H$$

$$V(G \boxtimes H) = V(G) \times V(H)$$

Adjacency matrix formulation:

The adjacency matrix of  $G \boxtimes H$  is the tensor product of those of  $G$  and  $H$

## Independence number is super-multiplicative

$$\alpha(G \boxtimes H) \geq \alpha(G)\alpha(H)$$

Example

$$\alpha(C_5) = 2$$

$$\alpha(C_5^{\boxtimes 2}) = 5$$

## Shannon capacity

$$\Theta(G) = \sup_n \alpha(G^{\boxtimes n})^{1/n}$$

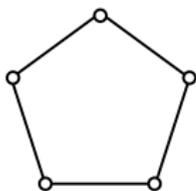
Example

$$\Theta(C_5) = \sqrt{5} \quad (\text{Lovász})$$

$$3.2578 \leq \Theta(C_7) \leq 3.3177 \quad (\text{Schrijver-Polak})$$

How to upper bound  $\alpha$  (and  $\Theta$ )?

## Matrix rank (Haemers bound)

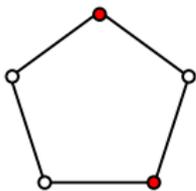


$$\begin{bmatrix} 1 & * & 0 & 0 & * \\ * & 1 & * & 0 & 0 \\ 0 & * & 1 & * & 0 \\ 0 & 0 & * & 1 & * \\ * & 0 & 0 & * & 1 \end{bmatrix}$$

1 on the diagonal

0 on the non-edges

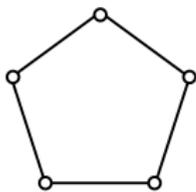
Every independent set gives an **identity sub-matrix**



$$\begin{bmatrix} 1 & * & 0 & 0 & * \\ * & 1 & * & 0 & 0 \\ 0 & * & 1 & * & 0 \\ 0 & 0 & * & 1 & * \\ * & 0 & 0 & * & 1 \end{bmatrix}$$

Independence number  $\alpha$  is at most **rank** of any such matrix  
(and  $\Theta$  too)

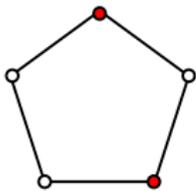
## Largest eigenvalue (Lovász theta function)



$$\begin{bmatrix} 1 & * & 1 & 1 & * \\ * & 1 & * & 1 & 1 \\ 1 & * & 1 & * & 1 \\ 1 & 1 & * & 1 & * \\ * & 1 & 1 & * & 1 \end{bmatrix}$$

1 on the diagonal  
1 on the non-edges

Every independent set gives an **all-ones sub-matrix**



$$\begin{bmatrix} 1 & * & 1 & 1 & * \\ * & 1 & * & 1 & 1 \\ 1 & * & 1 & * & 1 \\ 1 & 1 & * & 1 & * \\ * & 1 & 1 & * & 1 \end{bmatrix}$$

Independence number is at most **largest eigenvalue** of such matrix  
(and  $\Theta$  too)

Q: How good are the Haemers and Lovász bounds?

## 2. The asymptotic spectrum of graphs

Models graphs as points in real space

**Defined as** the set  $X$  of all maps  $F : \{\text{graphs}\} \rightarrow \mathbb{R}$  that are

1. additive under  $\sqcup$
2. multiplicative under  $\boxtimes$
3. monotone under cohomomorphism
4. normalized to 1 on the graph with one vertex  $E_1$

Graphs as real points:  $G \mapsto (F(G))_{F \in X}$

Examples of elements of  $X$

- Lovász theta function  $\vartheta$
- fractional Haemers bound (Bukh–Cox)
- fractional clique cover number

### 3. Duality theorem

Recall that

- Shannon capacity is a maximization:  $\Theta(G) = \sup_n \alpha(G^{\boxtimes n})^{1/n}$
- Lovász theta gives upper bound:  $\Theta(G) \leq \vartheta(G)$

#### Lemma

Every  $F \in X$  gives upper bound:  $\Theta(G) \leq F(G)$

Q: Are the upper bounds from  $F \in X$  powerful enough to reach  $\Theta$ ?

#### Duality Theorem (“yes”, Zuiddam)

Shannon capacity is a minimization:  $\Theta(G) = \min_{F \in X} F(G)$

Q: Is the duality theorem non-trivial?

Duality Theorem  $\Theta(G) = \min_{F \in X} F(G)$

Conjecture (Shannon)  $\Theta \in X$

Theorem (Haemers)

There are  $G, H$  for which  $\Theta(G \boxtimes H) > \Theta(G)\Theta(H)$

Theorem (Alon)

There are  $G, H$  for which  $\Theta(G \sqcup H) > \Theta(G) + \Theta(H)$

Corollary  $\Theta \notin X$

Q: How is the duality theorem proven?

Duality Theorem  $\Theta(G) = \min_{F \in X} F(G)$

More General Duality Theorem (Zuiddam)

$G^{\boxtimes n} \rightarrow H^{\boxtimes(n+o(n))}$  iff  $F(G) \leq F(H)$  for all  $F \in X$

Ideas:

- Real geometry, Positivstellensatz
- Kadison–Dubois representation theorem
- Extension of Linear Programming Duality

## 4. Consequences and new directions

**Theorem** (“Additivity if and only if multiplicativity”, Holzman)

For any graphs  $G, H$  the following are equivalent:

- (i)  $\Theta(G \sqcup H) = \Theta(G) + \Theta(H)$
- (ii)  $\Theta(G \boxtimes H) = \Theta(G)\Theta(H)$
- (iii) There is  $F \in X$  such that  $F(G) = \Theta(G)$  and  $F(H) = \Theta(H)$

**Proof** (i)  $\Rightarrow$  (iii)

Let  $F \in X$  such that  $\Theta(G \sqcup H) = F(G \sqcup H)$

Then  $\Theta(G) + \Theta(H) = \Theta(G \sqcup H) = F(G \sqcup H) = F(G) + F(H)$

Always:  $\Theta(G) \leq F(G)$  and  $\Theta(H) \leq F(H)$

Therefore  $\Theta(G) = F(G)$  and  $\Theta(H) = F(H)$  □

(iii)  $\Rightarrow$  (i)

$\Theta(G) + \Theta(H) \leq \Theta(G \sqcup H)$

$\leq F(G \sqcup H) = F(G) + F(H) = \Theta(G) + \Theta(H)$  □

Example (“Theorems of Haemers and Alon are equivalent”)

$$\Theta(G \boxtimes H) > \Theta(G)\Theta(H) \quad \text{iff} \quad \Theta(G \sqcup H) > \Theta(G) + \Theta(H)$$

Example (“Shannon capacity is not attained at a finite power”)

- $C_5 \boxtimes E_1 = C_5$
- $\Theta(C_5 \boxtimes E_1) = \Theta(C_5) = \Theta(C_5)\Theta(E_1)$
- $\Theta(C_5 \sqcup E_1) = \Theta(C_5) + \Theta(E_1) = \sqrt{5} + 1 \neq a^{1/n}$  for  $a, n \in \mathbb{N}$

## More general theorem

Let  $G_1, \dots, G_n$  be graphs. The following are equivalent:

- (i) For every polynomial  $p$  we have
$$\Theta(p(G_1, \dots, G_n)) = p(\Theta(G_1), \dots, \Theta(G_n))$$
- (ii) There exists a polynomial  $p$  (depending on all variables) such that  $\Theta(p(G_1, \dots, G_n)) = p(\Theta(G_1), \dots, \Theta(G_n))$
- (iii) There exists  $F \in X$  such that  $F(G_i) = \Theta(G_i)$  for all  $i$

These we can also make quantitative, relating non-additivity and non-multiplicativity

## New directions

- Topological structure of asymptotic spectra



Disconnected



Connected



Star-Convex



Convex

Stronger topological structure  $\Rightarrow$  new algorithmic methods  
(with Avi Wigderson)

- New notion of graph limits

$$\text{distance } d(G, H) = \sup_{F \in \mathcal{X}} |F(G) - F(H)|$$

(with David de Boer and Pjotr Buys)

- Hedetniemi properties of asymptotic spectrum

(with Jim Wittebol)

- Direct-sum theorems in other areas (tensors)

(with Visu Makam)

## Problems

- What are the elements of the asymptotic spectrum of graphs?
- What other problems in math, CS and physics have asymptotic spectrum duality?
- Lovász theta function for hypergraphs?

Studying the computational complexity of natural problems may both require and generate deep and sophisticated mathematics