# PHOEG Helps Obtaining Extremal Graphs 

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## Introduction

We consider simple undirected graphs.


For a graph $G=(V, E)$,
■ its order $|V|$ is denoted by $n$;
■ its size $|E|$ is denoted by $m$.
A graph invariant is a function on graphs that is constant on isomorphism classes.
Examples: order $n$, size $m$, chromatic number $\chi$, maximum degree $\Delta$, diameter $D$, planarity, ...

## Extremal Graph Theory

Extremal Graph Theory aims to find bounds on a graph invariant under some constraints.
Generally, those constraints are of two types:

- restricting class of graphs (e.g., connected graphs, trees);

■ fixing (and restricting) values of other invariants (e.g., size, maximum degree).
Results in Extremal Graph Theory mainly consists in

- giving bounds;
- characterizing graphs achieving these bounds.


## Computer-assisted discovery

■ Context: Computer-assisted Discovery in Extremal Graph Theory
■ Several existing systems: Graph, Graffiti, AutoGraphiX, GraPHedron, ...

- exploit different ideas to help graph theorists

■ Objectives of this talk:

- presentation of PHOEG, a successor of GraPHedron
- use of an illustrative problem (Eccentric Connectivity Index, ECI)
- Remark: work in progress
- PHOEG is currently a prototype
- the problem about ECI is not fully solved


## Overview of PHOEG

## PHOEG



## Eccentric Connectivity Index

Let $v$ be a vertex of a graph $G$, recall that:

- degree $d(v)=$ number of adjacent vertices of $v$;

■ eccentricity $\epsilon(v)=$ maximal distance between $v$ and any other vertex.

## Example



## Eccentric Connectivity Index

## Definition

The Eccentric Connectivity Index $(\mathrm{ECI})$ of a graph $G$, denoted by $\xi^{c}(G)$, is

$$
\xi^{c}(G)=\sum_{v \in V} d(v) \epsilon(v)
$$

## Example



$$
\xi^{c}(G)=(2 \times 2+3 \times 1) \times 2=14
$$

## Eccentric Connectivity Index

History and motivation
■ Sharma, Goswani and Madan introduced $\xi^{c}$ in 1997 in Chemistry;

- Useful as a discriminating topological descriptor for Structure Properties and Structure Activity studies;
■ Since 1997, more than 200 chemical papers about $\xi^{c}$ : applications in drug design, prediction of anti-HIV activities, etc.
■ However, the first mathematical paper with extremal properties on $\xi^{c}$ was published only in 2010;

■ Since 2010, about a dozen papers containing bounds on $\xi^{c}$.

## Some Extremal Theory problem about $\xi^{c}$

Now, let's make extremal graph theory about $\xi^{c}$ with the help of a computer.

First step: define a problem by choosing constraints.

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Several papers containing bounds on $\xi^{c}$ - using various invariants as constraints - have been published (since 2010).

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## Problem

Among connected graphs of order $n$ and size $m$, what is the maximum possible value for $\xi^{c}$ ?

## Upper bound on $\xi^{c}$ for connected graphs with fixed size

We define $E_{n, m}$ as follows :

$$
n=7, m=14
$$

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- The biggest possible clique
without disconnecting the graph, leaving a path with the remaining vertices.

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- Add remaining edges between vertices of the clique and the first vertex of the path.



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- Add remaining edges between vertices of the clique and the first vertex of the path.


This graph is unique for given n and m . We define $d_{n, m}$ as the diameter of

$$
E_{n, m}
$$

## Conjecture of Zhang, Liu and Zhou

## Conjecture (Zhang, Liu and Zhou, 2014)

Let $G$ be a graph of order $n$ and size $m$ such that $d_{n, m} \geq 3$. Then,

$$
\xi^{c}(G) \leq \xi^{c}\left(E_{n, m}\right),
$$

with equality if and only if $G \simeq E_{n, m}$.

- The authors prove that the conjecture is true when $m=n-1, n, \ldots, n+4$ (if $n$ is large enough).
■ There exists a "proof" published in a journal of University of Isfahan (Iran, 2014) but that is obviously wrong.


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with equality if and only if $G \simeq E_{n, m}$.

- Is the conjecture true?
- If yes, how to prove it?

■ If no, how to improve or correct it?
$■$ What about graphs such that $d_{n, m}<3$ ?

## How can the computer help?

In the following, we will show how PHOEG can help to study all of the preceding questions and to raise new ones.

| P | $\mathrm{H}_{\text {elps }}$ | $\mathrm{O}_{\text {btaining }} \mathrm{E}_{\text {xtremal }}$ |
| :--- | :--- | :--- | $\mathrm{G}_{\text {raphs }}$

## PHOEG - the database part

■ Former system (GraPHedron): graphs and invariant's values written sequentially in files;
■ PHOEG uses a PostgreSQL DB with tens of millions of non-isomorphic graphs and invariants' values;

- Invariant's values are computed once (useful for NP-hard invariants);


## Database of the invariants

■ Each graph has its unique signature used as primary key (canonical form, thanks to Nauty by Brendan McKay), sig( $\left.C_{5}\right)=$ " $D q K^{\prime}$ ", $\operatorname{sig}\left(K_{3}\right)=" B w "$.
■ 12 millions simple graphs up to order 10,8 millions cubic graphs up to order 22.

| Graphs |
| :--- |
| signature |
| $\mathrm{A}_{-}$ |
| A? |
| B? |
| BG |
| BW |
| BW |
| C‘ |
| C |
| C $\sim$ |
| C? |
| C@ |


| NumVertices |  |
| :--- | ---: |
| signature | val |
| $\mathrm{A}_{-}$ | 2 |
| $\mathrm{~A} ?$ | 2 |
| $\mathrm{~B} ?$ | 3 |
| BG | 3 |
| BW | 3 |
| BW | 3 |
| $\mathrm{C}^{‘}$ | 4 |
| $\mathrm{C}^{\sim}$ | 4 |
| $\mathrm{C} \sim$ | 4 |
| $\mathrm{C} ?$ | 4 |
| CQ | 4 |


| NumEdges |  |
| :--- | ---: |
| signature | val |
| $\mathrm{A}_{-}$ | 1 |
| A? | 0 |
| $\mathrm{~B} ?$ | 0 |
| BG | 1 |
| BW | 3 |
| BW | 2 |
| C C | 2 |
| C~ | 5 |
| $\mathrm{C} \sim$ | 6 |
| C? | 0 |
| C@ | 1 |


| ECI |  |
| :--- | ---: |
| signature | val |
| $\mathrm{A}_{-}$ | 2 |
| BW | 6 |
| Bw | 6 |
| $\mathrm{C}-$ | 14 |
| $\mathrm{C} \sim$ | 12 |
| CF | 9 |
| CN | 13 |
| Cr | 16 |
| CR | 14 |
| D ' $[$ | 25 |
| D ' $\{$ | 20 |

## GraPHedron's main principle

- view graphs as points in the space of invariants;



## GraPHedron's main principle

- view graphs as points in the space of invariants;
- compute the convex hull of these points (for small values of $n$ ).



## Database query - Points, multiplicities and polytope

| SELECT P.val AS eci, num_edges.val AS m, COUNT (*) AS mult | eci \| m |  |
| :---: | :---: | :---: |
| FROM eci P | 47 \| 8 | | 5 |
| JOIN num_vertices USING(signature) | 46 \| 8 | | 3 |
| JOIN num_edges USING(signature) | 40 \| 8 | 3 |
| WHERE num_vertices.val $=7$ | 32 \| 7 | | 3 |
| GROUP BY m, eci; | 48 \| 12 | | 55 |
|  | 48 \| 18 | 1 |
|  | 61 \| 14 | 4 |
|  | 59 \| 13 | 1 |
|  | 48 \| 11 | 17 |
| SELECT ST_AsText (ST_ConvexHull ( | 43 \| 9 | 14 |
| ST_Collect(ST_Point(eci, m))) | 47 \| 6 | 1 |
| FROM poly; | 64 \| 10 | 1 |
|  | 59 \| 11 | | 1 |
| st_astext | 45 \| 9 | | 7 |
| $\operatorname{POLYGON}((186,4221,6618,6817,6611,628,546,186)$ ) | $\begin{array}{cc} 38 & 1 \\ & 6 \\ {[\ldots .} \end{array}$ | 2 |

## Exploring $\xi^{c}$ with PHOEG: polytopes



## Exploring $\xi^{c}$ with PHOEG: polytopes



## Exploring $\xi^{c}$ with PHOEG: polytopes

Polytope for $n=7$


## Exploring $\xi^{c}$ with PHOEG: polytopes



## Exploring $\xi^{c}$ with PHOEG: polytopes



## Exploring $\xi^{c}$ with PHOEG: polytopes



## Observations and questions



- How to explain the grid?
- Is the conjecture of Zhang, Liu and Zhou true when $d_{n, m} \geq 3$ ?
- Upper bound when $d_{n, m}<3$ ?


## Database query - Polytope with some other information



## Coloring points with values of $d_{n, m}$



Recall that the conjecture is stated for $d_{n, m} \geq 3$. Is it true for $n=7$ ?

## Database query - Extremal graphs

```
WITH tmp AS (
    SELECT n.val AS n, m.val AS m,
        P.signature, P.val AS eci, d.val AS d,
        rank() OVER (
            PARTITION BY n.val, m.val
            ORDER BY P.val DESC
            ) AS pos
    FROM num_vertices n
    JOIN num_edges m USING(signature)
    JOIN d USING(signature)
    JOIN eci P USING(signature)
    WHERE n.val = 7
)
SELECT signature AS sig, n, m, eci, d
FROM tmp
WHERE pos = 1 AND d >= 3
ORDER BY n, m, d, eci;
```



## Database query - Extremal graphs

```
WITH tmp AS (
    SELECT n.val AS n, m.val AS m,
        P.signature, P.val AS eci, d.val AS d,
        rank() OVER (
            PARTITION BY n.val, m.val
            ORDER BY P.val DESC
            ) AS pos
    FROM num_vertices n
    JOIN num_edges m USING(signature)
    JOIN d USING(signature)
    JOIN eci P USING(signature)
    WHERE n.val = 7
)
SELECT signature AS sig, n, m, eci, d
FROM tmp
WHERE pos = 1 AND d >= 3
ORDER BY n, m, d, eci;
```

    \(\Rightarrow\) counter-example to the conjecture !
    Extremal graphs are not always unique
    
## Counter-example ( $n=7$ and $m=15$ )



## Counter-example $(n=7$ and $m=15)$



## Counter-example $(n=7$ and $m=15)$



It is possible to construct counter-examples for any values of $n \geq 6$ (with $d_{n, m}=3$ ).

## Coloring points with values of $d_{n, m}$



Upper bound when $d_{n, m}<3$ ?

Upper facet of the polytope $(n=7)$


## Coloring points with values of the diameter

Polytope for $n=7$ with values for diameter $D$


## Coloring points with values of the diameter

Polytope for $n=7$ with values for diameter $D$


Can the diameter explain the blue grid? Actually, yes!

## A new tight upper bound when $d_{n, m}<3$

## Theorem

Let $G$ be a graph of order $n$ and size $m$. Then,

$$
\xi^{c}(G) \leq n(n-1)(n-2)-2 m(n-3),
$$

with equality if and only if $G$ is the complement of a matching.
Note that the bound is valid for all graphs but can be tight only if

$$
m \geq\binom{ n}{2}-\left\lfloor\frac{n}{2}\right\rfloor
$$

(and thus $d_{n, m}<3$ ).

## Number of non-equivalent colorings

We note $P(G, k)$ the number of non-equivalent colorings of $G$ that use exactly $k$ colors.


$$
\begin{gathered}
\mathrm{P}\left(\mathrm{P}_{3}, 2\right)=1 \\
\mathrm{O}-\mathrm{O} \\
\mathrm{P}\left(\mathrm{P}_{3}, 3\right)=1
\end{gathered}
$$

## Total number of non-equivalent colorings

## Definition

The total number of non-equivalent colorings $\mathcal{P}(G)$ of a graph $G$ is

$$
\mathcal{P}(G)=\sum_{k=0}^{n} \mathrm{P}(G, k)=\sum_{k=\chi(G)}^{n} \mathrm{P}(G, k),
$$

where $\chi(G)$ is the chromatic number of $G$.

Example: $\mathcal{P}\left(\mathrm{P}_{3}\right)=\mathrm{P}\left(\mathrm{P}_{3}, 2\right)+\mathrm{P}\left(\mathrm{P}_{3}, 3\right)=1+1=2$
$\mathcal{P}(G)$ is the value of the $\sigma$-polynomial when $x=1$ and is also known as the Bell number of a graph [Duncan \& Peele, 2009].

## The Min-NumCol-NumEdges Problem

## Problem

What is minimum possible value of $\mathcal{P}$ for graphs of fixed order $n$ and size $m$ and what are the graphs attaining those bounds ?

## Some extremal graphs



## The extremal(?) graphs

Given $n$ the order and $m$ the size of graphs. Let $t_{k}$ be the biggest triangular number such that $t_{k} \leq m$. We call $r_{m}=m-t_{k}$ the remainder.

We define $G^{*}(n, m)$ as the unique graph formed from $K_{k+1} \bigcup \bar{K}_{n-k-1}$, where one (if any) vertex of $\bar{K}_{n-k-1}$ is connected to $r_{m}$ vertices of the clique.

If $r_{m}=1$, and $n-k-1 \geq 2$, we define $G^{\prime}(n, m)$ as $K_{k+1} \cup \bar{K}_{n-k-1}$, where two vertices of $K_{k+1} \cup \bar{K}_{n-k-1}$ are connected.


## Forbidden Graph Characterization

In this tool, we want a necessary and sufficient characterization of our graphs.


## Concluding remarks

■ Not only extremal graphs are useful to study extremal properties of an invariant

- Exact approach limited to small graphs ( $n \leq 10$ )
- However, dealing with small graphs has already shown to be very useful and led to numerous results (AutoGraphiX, GraPHedron)


## Perspectives

■ Invariants' DB allows a form of dynamic programming;

- Create a simple interface for queries, define a domain specific language;
- Allow easy visualization and manipulation of outputs (GUI, PDF, etc.);

■ Go up in the order of graphs, relaxing the exact constraint.

## Appendix

## Understanding the grid of blue points



- Suppose $D(G)=2$ (light blue points)
- For each vertex v , since $D(G)=2$, either $\epsilon(v)=1$ or $\epsilon(v)=2$
- If $\epsilon(v)=1$, then $v$ is dominant and $d(v)=n-1$
- Let $k$ be the number of dominant vertices of $G$
- The sum of degrees of non dominant vertices is

$$
2 m-k(n-1)
$$

Thus,

$$
\xi^{c}(G)=k(n-1)+2(2 m-k(n-1))=4 m-k(n-1)
$$

that is maximum if $k=0$ and, moreover, explain the grid.

## Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Definition

For positive integers $n$ and $m$ with $n-1 \leq m \leq\binom{ n}{2}$, let

$$
d_{n, m}=\left\lfloor\frac{2 n+1-\sqrt{17+8(m-n)}}{2}\right\rfloor .
$$

In the following, we simply use $d$ for $d_{n, m}$.

## Definition

Let $E_{n, m}$ be the graph obtained from a clique $K_{n-d-1}$ and a path $P_{d+1}=v_{0} v_{1} \ldots v_{d}$ by joining each vertex of the clique to both $v_{d}$ and $v_{d-1}$, and by joining

$$
m-n+1-\binom{n-d}{2}
$$

vertices of the clique to $v_{d-2}$.

Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | $\mathbf{4}$ | 5 | 6 | 7 | 8 | 9 | 10 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | $\mathbf{4}$ | 3 | 3 | 2 | 2 | 2 | 1 |
| $n-d-1$ | $\mathbf{0}$ | 1 | 1 | 2 | 2 | 2 | 3 |
| $\#$ edges to $v_{d-2}$ | $\mathbf{0}$ | 0 | 1 | 0 | 1 | 2 | 0 |

Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | 4 | $\mathbf{5}$ | 6 | 7 | 8 | 9 | 10 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | 4 | $\mathbf{3}$ | 3 | 2 | 2 | 2 | 1 |
| $n-d-1$ | 0 | $\mathbf{1}$ | 1 | 2 | 2 | 2 | 3 |
| $\#$ edges to $v_{d-2}$ | 0 | $\mathbf{0}$ | 1 | 0 | 1 | 2 | 0 |



Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | 4 | 5 | $\mathbf{6}$ | 7 | 8 | 9 | 10 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | 4 | 3 | $\mathbf{3}$ | 2 | 2 | 2 | 1 |
| $n-d-1$ | 0 | 1 | $\mathbf{1}$ | 2 | 2 | 2 | 3 |
| $\#$ edges to $v_{d-2}$ | 0 | 0 | $\mathbf{1}$ | 0 | 1 | 2 | 0 |



Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | 4 | 5 | 6 | $\mathbf{7}$ | 8 | 9 | 10 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | 4 | 3 | 3 | 2 | 2 | 2 | 1 |
| $n-d-1$ | 0 | 1 | 1 | 2 | 2 | 2 | 3 |
| $\#$ edges to $v_{d-2}$ | 0 | 0 | 1 | $\mathbf{0}$ | 1 | 2 | 0 |



Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | 4 | 5 | 6 | 7 | $\mathbf{8}$ | 9 | 10 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | 4 | 3 | 3 | 2 | $\mathbf{2}$ | 2 | 1 |
| $n-d-1$ | 0 | 1 | 1 | 2 | $\mathbf{2}$ | 2 | 3 |
| $\#$ edges to $v_{d-2}$ | 0 | 0 | 1 | 0 | $\mathbf{1}$ | 2 | 0 |



Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | 4 | 5 | 6 | 7 | 8 | $\mathbf{9}$ | 10 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | 4 | 3 | 3 | 2 | 2 | $\mathbf{2}$ | 1 |
| $n-d-1$ | 0 | 1 | 1 | 2 | 2 | $\mathbf{2}$ | 3 |
| $\#$ edges to $v_{d-2}$ | 0 | 0 | 1 | 0 | 1 | $\mathbf{2}$ | 0 |



Upper bound on $\xi^{c}$ for connected graphs with fixed size

## Example ( $n=5$ )

| $m$ | 4 | 5 | 6 | 7 | 8 | 9 | $\mathbf{1 0}$ |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $d$ | 4 | 3 | 3 | 2 | 2 | 2 | $\mathbf{1}$ |
| $n-d-1$ | 0 | 1 | 1 | 2 | 2 | 2 | $\mathbf{3}$ |
| $\#$ edges to $v_{d-2}$ | 0 | 0 | 1 | 0 | 1 | 2 | $\mathbf{0}$ |



## What about other classes of graphs ?

Let's try to maximize $\xi^{c}$ on cubic (3-regular) graphs.
SELECT t.n, t.signature, t.eci
FROM (
SELECT n.val AS n, eci.signature, eci.val as eci, DENSE_RANK() OVER (

PARTITION BY n.val
ORDER BY eci.val DESC
) AS pos
FROM cubic
JOIN num_vertices n USING(signature)
JOIN eccentric_connectivity_index eci USING(signature)
) t
WHERE t.pos = 1
ORDER BY t.n;

## Maximize $\xi^{c}$ on cubic graphs

| n | signature | \| eci |
| :---: | :---: | :---: |
| 4 | C~ | 12 |
| 6 | Es\o | 36 |
| 6 | E\{Sw | 36 |
| 8 | Gv? IXW | 72 |
| 8 | Gs@ipo | 72 |
| 10 | Iv?GOKFY? | \| 126 |
| 12 | Kt?GOKFOAOeA | \| 177 |
| 14 | Mt?Go?@@_KgKOWM?? | \| 270 |
| 16 | Ot?G?CA?WB'o0?0?b_@?E | \| 348 |
| 18 | Qv??W[K?G??@?B?B?A??‘'G?p??0 | \| 474 |
| 20 |  | \| 573 |
| 22 | Uv?G?CK?oE@_?H?E??G?C??C??W?@??@C_?K0??० | \| 726 |









