

Automated Conjecturing for Proof Discovery

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8 May 2016

Kiran Chilakamarri—On Conjectures



Goal

To tell you about a new idea for using our conjecture-generating program:

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generating sketches of proofs (or proof ideas);

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To tell you about a new idea for using our conjecture-generating program:

generating sketches of proofs (or proof ideas);

and a new proof of the Friendship Theorem.

Our Program

Black box.

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Main **heuristic idea** from Fajtlowicz's Graffiti.

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Ingredients: Objects, Invariants, Properties, Choice of Invariant or property of interest, choice of upper or lower bounds.

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- ▶ Lots of Graph Theory: graphs, invariants, properties, constructors, . . .

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- ▶ Lots of Graph Theory: graphs, invariants, properties, constructors, . . .
- ▶ Growing

The Program

The screenshot shows a web browser window with several tabs open. The active tab is 'nvcleemp.github.io/conjecturing/'. The page content is as follows:

Conjecturing

[View the Project on GitHub](#)
nvcleemp/conjecturing

[Download ZIP File](#) [Download TAR Ball](#) [View On GitHub](#)

This project is maintained by [nvcleemp](#)

Hosted on GitHub Pages — Theme by [orderedlist](#)

Conjecturing for Sage

This repository contains the code described in the paper Automated Conjecture-making: Fajtlowicz's Dalmatian Heuristic Revisited.

Quickstart

See the directory `spkg` for instructions on how to build and install a Sage package containing the expressions program. Once you have built and installed such a Sage package, you can use the Python files in the directory `sage` to interact with the package.

Open the directory `sage` in a terminal window and start Sage. Usually this is done using the following command:

```
$ sage
```

Once Sage has started, you can load the file `conjecturing.py`:

```
sage: attach('conjecturing.py')
```

You can also choose to load any of the other files, but this is not necessary.

An example run might look like this:

```
sage: attach('conjecturing.py')
sage: attach('numbertheory.nv')
```

At the bottom of the browser window, a file manager shows several files: 'stein.png', 'hansen.gif', 'nvcleemp-conjectu...tar.gz', and 'nvcleemp-conjecturin...zip'. A 'Show All' button is visible on the right.

Properties

Example: `pairs_have_unique_common_neighbor:`

Every pair of vertices has exactly one common neighbor.

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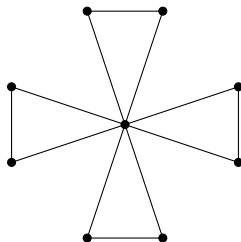


Figure: A flower F_4 with four petals.

Sufficient Condition Conjectures

164 graphs in the main database

87 properties

5 propositional operators: and, or, implies, not, xor

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```
#using ALL graph_objects
#sufficient condition conjectures for pairs_have_unique_common_neighbor

property = properties.index(pairs_have_unique_common_neighbor)
conjs = propertyBasedConjecture(graph_objects, properties, property,
                                sufficient = True, precomputed = precomputed)
for c in conjs:
    print c

> Generation process was stopped by the conjecturing heuristic.
> Found 5 unlabeled trees.
> Found 24895 labeled trees.
> Found 486 valid expressions.
((~(is_triangle_free))&(is_cycle))->(pairs_have_unique_common_neighbor)
((~(is_split))&(has_star_center))->(pairs_have_unique_common_neighbor)
```

What you get

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Conjectures that are true for *all* input objects.

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Conjectures that say something not implied by any previously output conjecture.

Theory

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property = pairs_have_unique_common_neighbor
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theory = [is_k3]
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    property, theory = theory, sufficient = True,  
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    property, theory = theory, sufficient = True,  
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```

Conjecture:

```
((is_eulerian)&(is_planar))&(is_gallai_tree)->  
    (pairs_have_unique_common_neighbor)
```

Proof Sketch Generating Idea

- ▶ Prove: $P \implies Q$.
- ▶ Run necessary condition conjectures for P , using Q as the “theory”.
- ▶ The generated conjectures must be “better” than Q for at least one graph conjectures.

- ▶ Get:

$$P \implies C_1$$

$$P \implies C_2$$

- ▶ By the truth test, each object x that has property P has properties C_1 and C_2 .
- ▶ Thus x is in the intersection of the set of graphs having properties C_1 and C_2 .
- ▶ If there is x in the graph database with x in $C_1 \cap C_2$ but $x \notin Q$ then program wouldn't stop—as conjectures could be improved.

Proof Sketch Generating Idea

- ▶ Prove: $P \implies Q$.
- ▶ Run necessary condition conjectures for P , using Q as the “theory”.

- ▶ **Lemma 1:**

$$P \implies C_1$$

- ▶ **Lemma 2:**

$$P \implies C_2$$

- ▶ **Lemma 3:**

$$C_1 \cap C_2 \subseteq Q$$

- ▶ Then lemmas imply **Theorem:**

$$P \implies Q$$

- ▶ (semantic proof)

The Friendship Theorem

If every pair of people in a group have exactly one friend in common, then there is a person in the group that is friends with all of them.

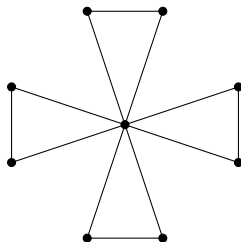
The Friendship Theorem

If every pair of people in a group have exactly one friend in common, then there is a person in the group that is friends with all of them.

If every pair of vertices in a graph have a unique common neighbor, then there is a vertex in the graph that is adjacent to all the other vertices (Erdős, Rényi, Sós, 1966).

The Friendship Theorem

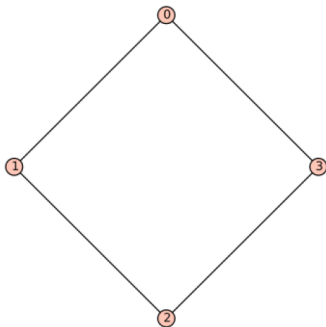
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Useful Observation: Can't have any four-cycles.



Conjectured Lemmas

Investigate:

`(pairs_have_unique_common_neighbor) -> (has_star_center)`

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theory = [has_star_center]
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Conjectures:

```
(pairs_have_unique_common_neighbor)->(is_eulerian)
```

```
(pairs_have_unique_common_neighbor)->(is_circular_planar)
```

```
(pairs_have_unique_common_neighbor)->(is_gallai_tree)
```

Conjectured Lemma 1

`(pairs_have_unique_common_neighbor)->(is_eulerian)`

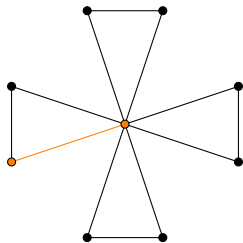
Euler's criterion: A connected graph is eulerian if and only if every degree is even.

Conjectured Lemma 1

$(\text{pairs_have_unique_common_neighbor}) \rightarrow (\text{is_eulerian})$

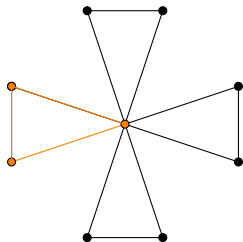
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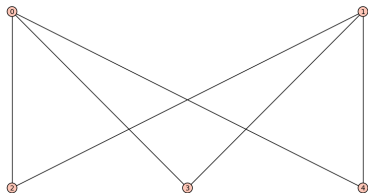
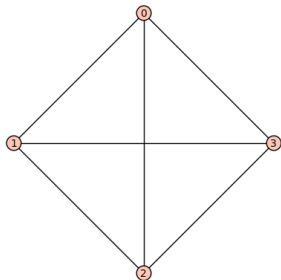
Conjectured Lemma 2

`(pairs_have_unique_common_neighbor)->(is_circular_planar)`

Theorem (Chartrand & Harary, 1967) A graph is outerplanar if and only if it does not contain a subdivision of K_4 or $K_{3,3}$.

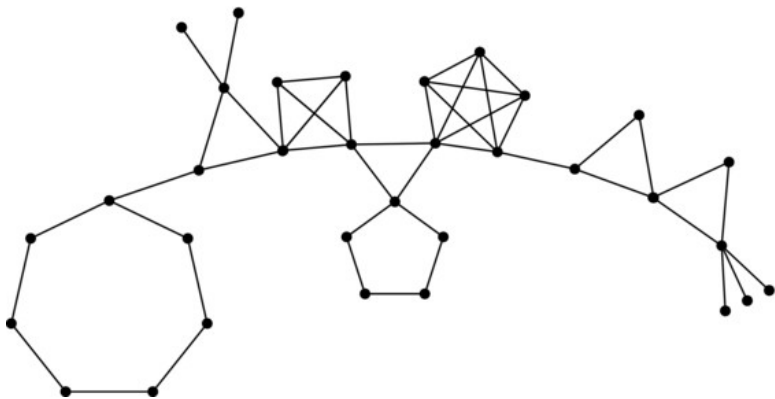
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Conjectured Lemma 3

$(\text{pairs_have_unique_common_neighbor}) \rightarrow (\text{is_gallai_tree})$



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Proof Main Ideas:

- ▶ Two-connected Gallai-trees are complete graphs or odd cycles.

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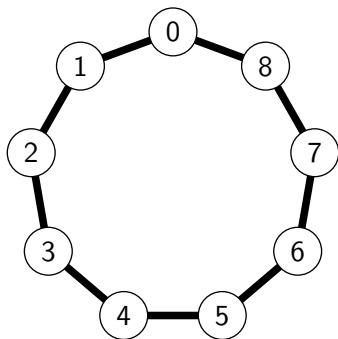
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- ▶ So each block is a triangle.
- ▶ All components of $G - v$ are Gallai trees.

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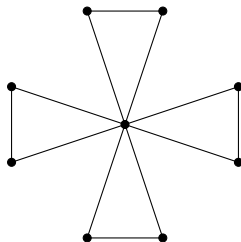
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- ▶ So it has at most one cut vertex, and all blocks are triangles.



Using Conjectures to Investigate Lemma 2

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Conjectures:

```
(pairs_have_unique_common_neighbor)->  
  ((is_regular)->(is_planar_transitive))  
(pairs_have_unique_common_neighbor)->(is_interval)  
(pairs_have_unique_common_neighbor)->(is_factor_critical)  
(pairs_have_unique_common_neighbor)->(is_kite_free)
```

New Project—Graph Theory

164 graphs with precomputed data

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164 graphs with precomputed data

145 graphs with some missing data

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87 properties

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78 invariants

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Open-source, on [GitHub](#)—anyone can use these definitions or add to them.

Human's Can't Make Better Conjectures

There are no simpler statements that are true and significant.



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Kiran would have liked that.

Thank You!

Automated Conjecturing in Sage:

<http://nvcleemp.github.io/conjecturing/>

C. E. Larson and N. Van Cleemput, Automated Conjecturing I:
Fajtlowicz's Dalmatian Heuristic Revisited, Artificial Intelligence
231 (2016) 17-38.

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