

# A Study of Domino Parity and $k$ -Parity Constraints for the TSP

William Cook   Daniel Espinoza   Marcos Goycoolea

School of Industrial and Systems Engineering  
Georgia Institute of Technology

IPCO 2005

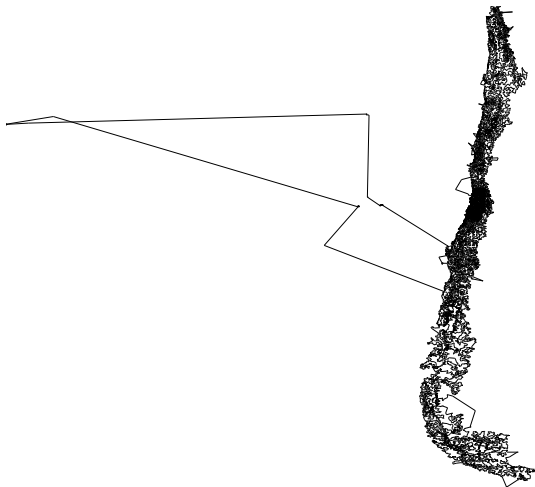
# The Traveling Salesman Problem

min  $cx$

$$\sum_{e \in \delta(v)} x_e = 2 \quad \forall v \in V$$

$$\sum_{e \in \delta(S)} x_e \geq 2 \quad \forall S \subsetneq V$$

$$x_e \in \{0, 1\} \quad \forall e \in E$$



## “ Separating a Superclass of Comb Inequalities in Planar Graphs ”

- Adam E. Letchford      [ Math of OR, 2000 ]

- Introduces a class of inequalities called “Domino Parity Constraints” which generalize comb inequalities.
- Proves that these constraints can be separated in polynomial time in planar graphs

## 1 The Domino Parity Constraints

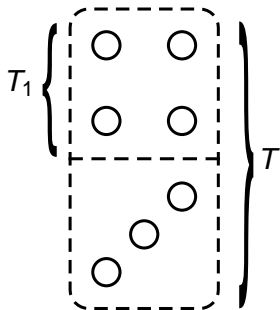
- Introduction
- Separation
- Computational Results

## 2 The $k$ -Parity Constraints

- Validity
- Separation
- Computational Results

## Definition (Domino)

A *domino* is a pair of sets  $(T_1; T)$  such that  $\emptyset \subsetneq T_1 \subsetneq T \subsetneq V$ .

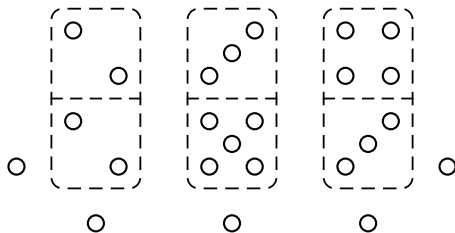


## Lemma

For any valid tour  $x \in \{0, 1\}^E$ ,

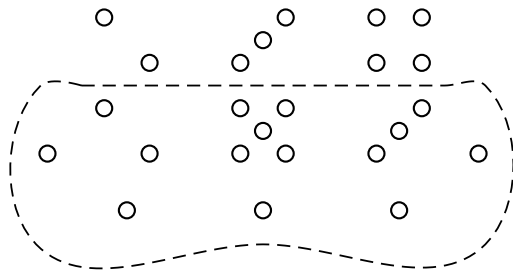
$$x(E(T_1 : T \setminus T_1)) + x(\delta(T)) \geq 3$$

# The Domino Parity Constraint



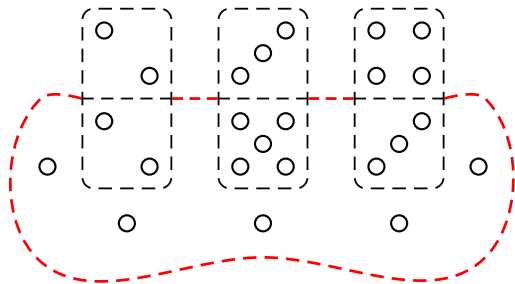
$$\sum_{T \in \mathcal{T}} x(E(T_1 : T \setminus T_1)) + \sum_{T \in \mathcal{T}} x(\delta(T)) \geq 3p$$

# The Domino Parity Constraint



$$\sum_{T \in \mathcal{T}} x(E(T_1 : T \setminus T_1)) + \sum_{T \in \mathcal{T}} x(\delta(T)) \geq 3p$$

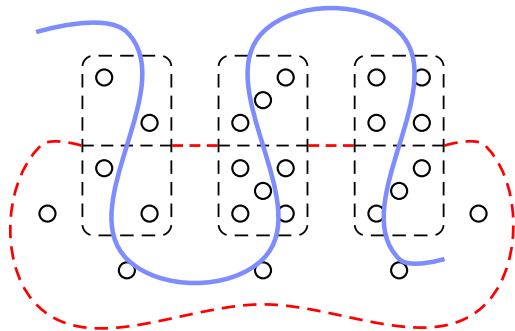
# The Domino Parity Constraint



$$x(F_H) + \sum_{T \in \mathcal{T}} x(E(T_1 : T \setminus T_1)) + \sum_{T \in \mathcal{T}} x(\delta(T)) \geq 3p + 1$$

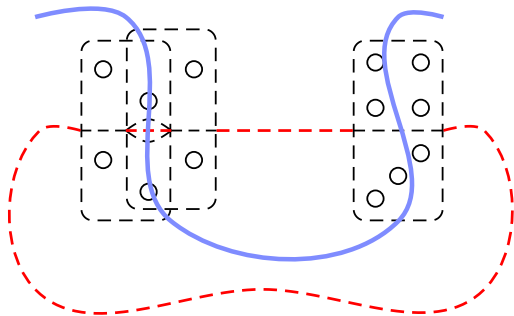


# The Domino Parity Constraint



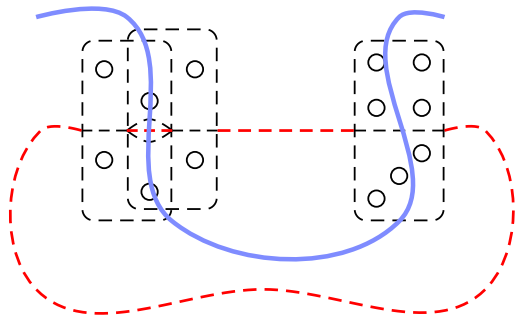
$$x(F_H) + \sum_{T \in \mathcal{T}} x(E(T_1 : T \setminus T_1)) + \sum_{T \in \mathcal{T}} x(\delta(T)) \geq 3p + 1$$

# The Domino Parity Constraint II



$$x(F_H) + \sum_{T \in \mathcal{T}} x(E(T_1 : T \setminus T_1)) + \sum_{T \in \mathcal{T}} x(\delta(T)) \geq 3p + 1$$

# The Domino Parity Constraint II



$$\mu^H \mathbf{x} + \sum_{T \in \mathcal{T}} \mathbf{x}(\delta(T)) \geq 3p + 1$$

## Definition (Support Graph)

Let,

$$E^* = \{e \in E : x_e^* > 0\}$$

The *support graph* of  $G$  is the sub-graph  $G^* = (V, E^*)$ .

Henceforth assume:

- $x^* \in \mathbb{Q}_+^E$  satisfies all subtour elimination constraints.
- $G^*$  is planar, and  $\bar{G}^*$  is its dual.
- For  $F \subseteq E^*$  let  $\bar{F}$  be corresponding edges in  $\bar{G}^*$ .

## Definition (Super-Connectivity)

A domino  $(T_1; T)$  is *super-connected* if:

- $T$  and  $V \setminus T$  are connected in  $G^*$ .
- $T_1$  and  $T \setminus T_1$  are connected in  $G^*$ .
- $x^*(E(T_1 : V \setminus T)) > 0$  and  $x^*(E(T \setminus T_1 : V \setminus T)) > 0$ .

## Lemma

*Every tooth  $(T_1; T)$  in a violated domino-parity is super-connected.*

## Lemma

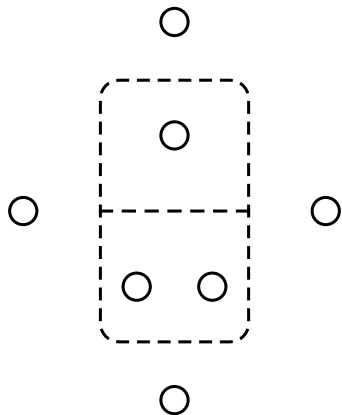
*If a tooth  $(T_1; T)$  is super-connected, then*

- $C = \overline{\delta(T)}$  is a simple cycle in  $\bar{G}^*$ .
- $P = \overline{E(T_1 : T \setminus T_1)}$  is a simple path with end-points in  $C$ .

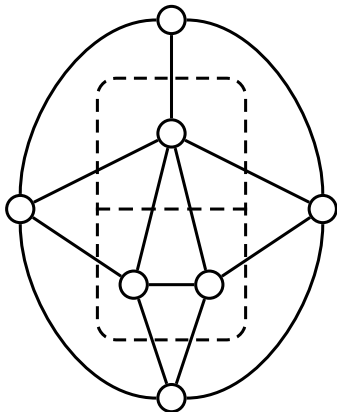
Observation:

There exist two nodes  $s, t \in V(\bar{G}^*)$  such that  $C \cup P$  define three disjoint paths in  $\bar{G}^*$ .

# Super Connectivity : An Example

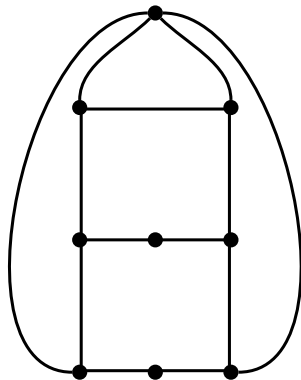
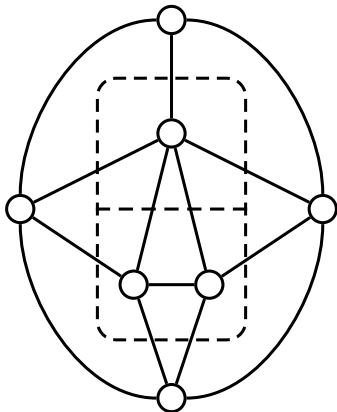


# Super Connectivity : An Example

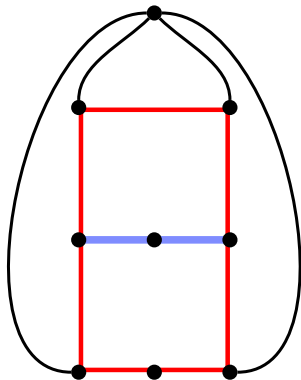
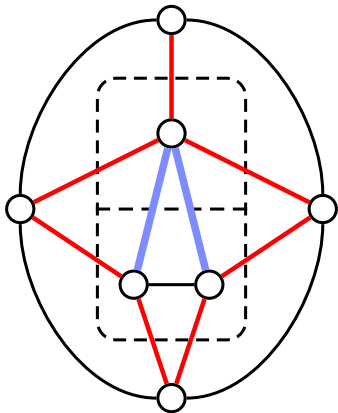




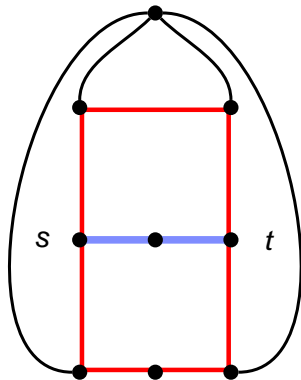
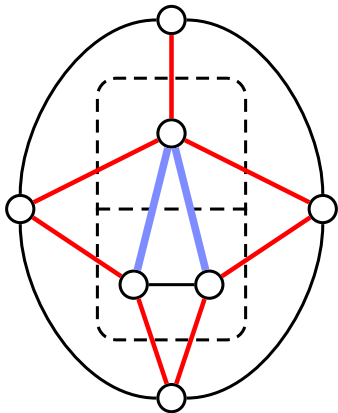
# Super Connectivity : An Example



# Super Connectivity : An Example



# Super Connectivity : An Example



# Min Weight Odd Circuit Problem

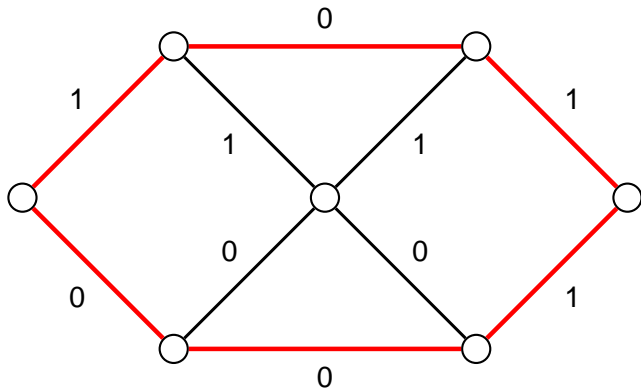
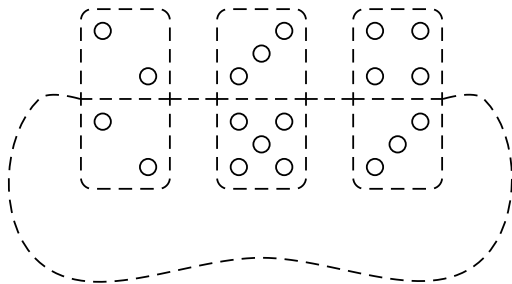


Figure: An Odd Circuit

# Characterization of Domino Parity Constraints

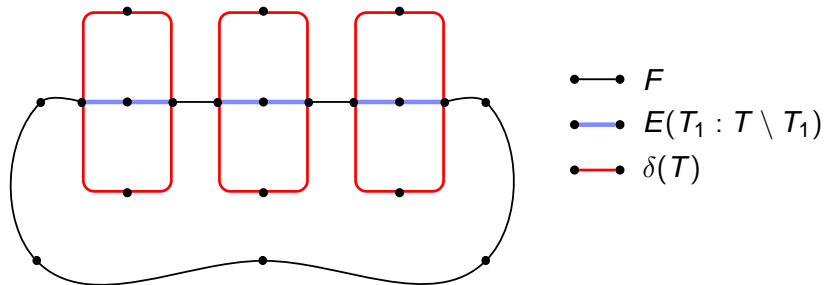
Domino Parity Constraint: Primal Form.



Idea: Reduce cut-generation to min-weight odd circuit problem.

# Characterization of Domino Parity Constraints

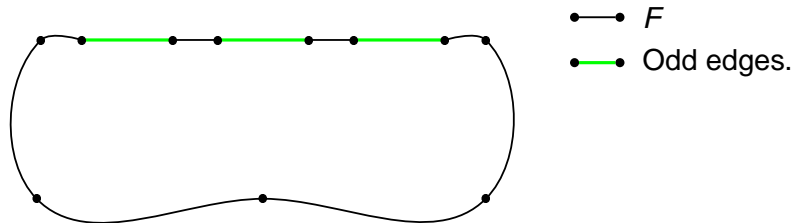
Domino Parity Constraint: Dual Form.



Idea: Reduce cut-generation to min-weight odd circuit problem.

# Characterization of Domino Parity Constraints

Domino Parity Constraint: Extended Dual Form.



Black edges + odd edges define an odd circuit.

# Implementation: Planarization

If graph is not planar, identify a forbidden minor. Then:

- **Contract edges.**

Contracting nodes which are not connected in the minor eliminates it from the shrunk graph.

- **Delete edges.**

Careful! Deleting edges means losing validity of Subtour elimination constraints.



# Implementation: Speed-Ups

- **Pruning** to restrict search space.  
Allows us to build cuts in BB tree, even in largest instances.
- **Safe shrinking** to reduce problem size.  
70% - 90% smaller graphs obtained.
- **Random walk** to generate more cuts.  
Thousands of cuts generated per run.
- **Tighten** to re-utilize old cuts.  
Thousands of cuts generated per round.  
Generates cuts not visible after planarization.

# Tests on TSPLIB

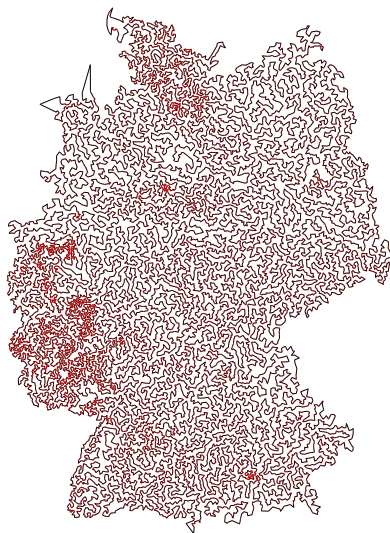
Improvements to Root LP on 8 largest TSPLIB problems:

| Name      | GAP Closed |
|-----------|------------|
| pla7397   | 67%        |
| rl11849   | 66%        |
| usa13509  | 55%        |
| brd14051  | 52%        |
| d15112    | 47%        |
| d18512    | 40%        |
| pla33810  | 38%        |
| pla85900* | 27%        |

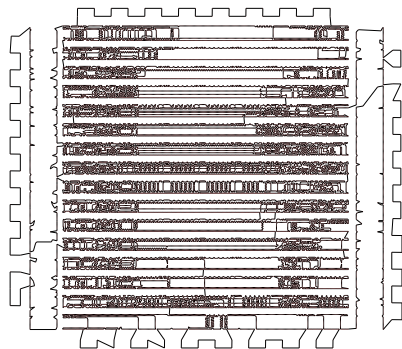
(\*) Problem is not optimally solved as of yet.

# Previously Unsolved Problems: d18512.

Number of Cities: 18,512.  
Origin: Cities of Germany.  
Optimal Solution: 645,238.  
BB Nodes: 424,241.  
Approx. Sol. Time: 57.5 years.



# Previously Unsolved Problems: pla33810.



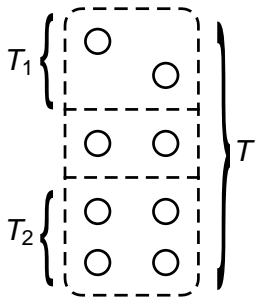
Number of Cities: 33,810.  
Origin: Circuit Board Design.  
Optimal Solution: 66,048,945.  
BB Nodes: 577.  
Approx. Sol. Time: 15.7 years.  
Largest TSP instance solved!

# $k$ -Dominoes

## Definition ( $k$ -Domino)

A  $k$ -domino consists of  $k + 1$  sets  $(T_1, T_2, \dots, T_k; T)$  such that:

- $\emptyset \subsetneq T_i \subsetneq T \subsetneq V$  for all  $i = 1, \dots, k$
- The edges  $\bigcup \{E(T_i : T \setminus T_i) : i \in I\}$  define a  $|I| + 1$  cut in the subgraph of  $G$  induced by  $T$ , for all  $\emptyset \subsetneq I \subset \{1, \dots, k\}$ .

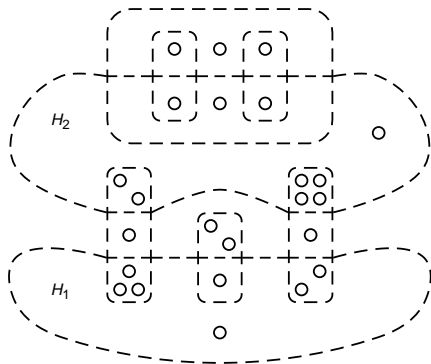


## Lemma

For any valid tour  $x \in \{0, 1\}^E$ ,

$$\frac{x(\delta(T)) - 2}{2} + \sum_{i=1}^k x(E(T_i : T \setminus T_i)) \geq k$$

# The $k$ -Parity Constraint



- $\Lambda(T) \subseteq \mathcal{H} \quad \forall T \in \mathcal{T}$
- $\Lambda(H) \subseteq \mathcal{T} \quad \forall H \in \mathcal{H}$
- $|\Lambda(H)|$  odd  $\quad \forall H \in \mathcal{H}$
- $T \leftarrow |\Lambda(T)|\text{-domino} \quad \forall T \in \mathcal{T}$

$$\sum_{H \in \mathcal{H}} \mu^H x + \sum_{T \in \mathcal{T}} x(\delta(T)) \geq 2|\mathcal{T}| + |\mathcal{H}| + \sum_{H \in \mathcal{H}} |\Lambda(H)|$$

## Definition (Super-Connectivity)

A  $k$ -domino  $(T_1, T_2, \dots, T_k; T)$  is *super-connected* if:

- $T$  and  $V \setminus T$  are connected in  $G^*$ .
- $T_i$  and  $T \setminus T_i$  are connected in  $G^* \quad \forall i = 1, \dots, k.$
- $x^*(E(T_i : V \setminus T)) > 0$  and  $x^*(E(T \setminus T_i : V \setminus T)) > 0 \quad \forall 0 \leq i \leq k.$

## Question

*Is every  $k$ -domino in a violated constraint super-connected?*

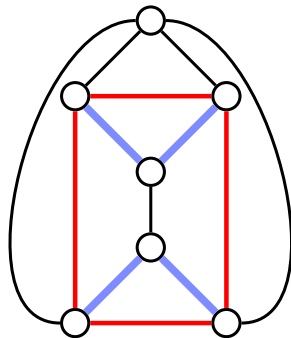
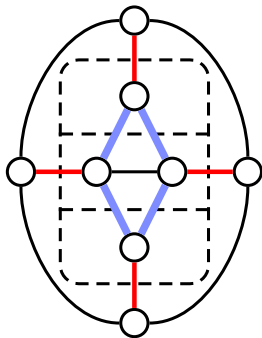
## Lemma

*If a  $k$ -domino  $(T_1, T_2, \dots, T_k; T)$  is super-connected, then*

- $C = \overline{\delta(T)}$  is a simple cycle in  $\bar{G}^*$ .*
- $P_i = \overline{E(T_i : T \setminus T_i)}$  is a simple path with end-points in  $C$ .*
- All of the paths  $P_i$  are on the same side of  $C$  with regard to the planar embedding.*



# Super Connectivity : An Example



# Separation Algorithm: A key step.

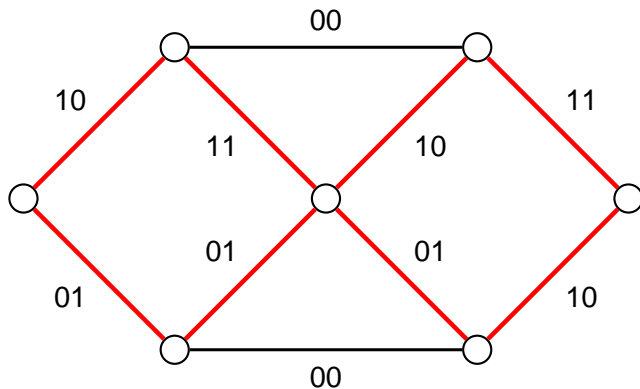
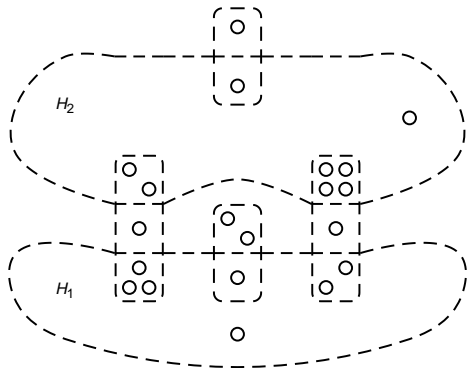


Figure: A 11-Parity Euler Subgraph

For Clique Trees:

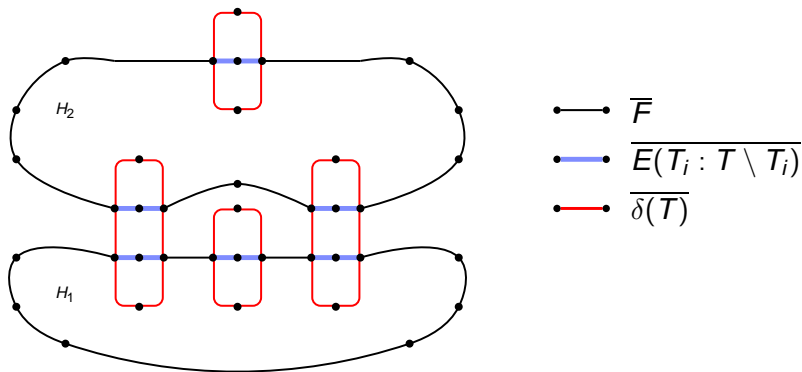
Problem Reduces to Min-Weight- $1^k$ -Parity Euler Subgraph Problem

# Characterization of $k$ -Parity Constraints



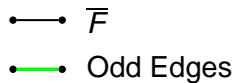
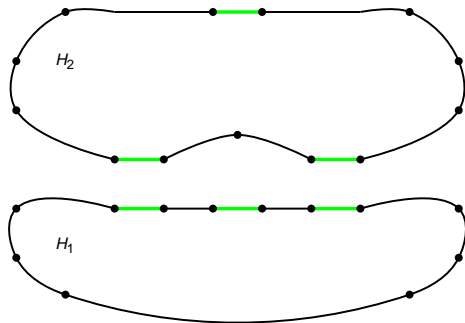
Idea: Each handle can be modelled as an odd circuit.

# Characterization of $k$ -Parity Constraints



Here we consider relevant edges in the dual of the support graph.

# Characterization of $k$ -Parity Constraints



We observe two odd eulerian graphs: One for each handle.

# A Separation Heuristic for $k = 2$ .

## Heuristic:

- Find a Domino-Parity constraint with slack as small as possible.
- Grow a second handle by solving a constrained odd circuit problem.

## Other Implementation Details:

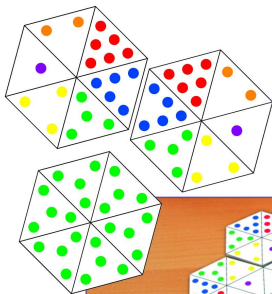
- Planarization, Pruning.
- Shrinking, Tighten.

How much do these new cuts close the gap?

| Instance | DP     | 2P     |
|----------|--------|--------|
| pcb3038  | 75.38% | 14.06% |
| fnl4461  | 45.46% | 19.05% |
| rl5914   | 61.76% | 10.58% |
| rl5934   | 64.98% | 26.32% |

Each test instance was ran ten times.  
Results are computed from average solutions.

# Thank you! Questions?



Heximoos takes  
dominoes to a whole  
new level of strategy  
and fun!

