

A New Contraction Technique with Applications to Congruency-Constrained Cuts

Martin Nägele Rico Zenklusen
ETH Zürich

Introduction: Congruency-Constrained Cuts

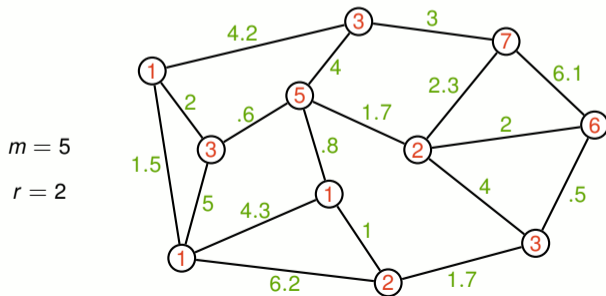
Problem Setting, Motivation, and Our Results

Problem Setting

Congruency-Constrained Minimum Cut Problem (CCMC)

Input: Graph $G = (V, E)$, edge weights $w: E \rightarrow \mathbb{R}_{\geq 0}$, vertex multiplicities $\gamma: V \rightarrow \mathbb{Z}_{\geq 0}$, $m \in \mathbb{Z}_{>0}$, and $r \in \mathbb{Z}_{\geq 0}$.

Goal: Find a minimizer of $\min \left\{ w(\delta(C)) \mid \begin{array}{l} \emptyset \subsetneq C \subsetneq V, \\ \sum_{v \in C} \gamma(v) \equiv r \pmod{m} \end{array} \right\}$.

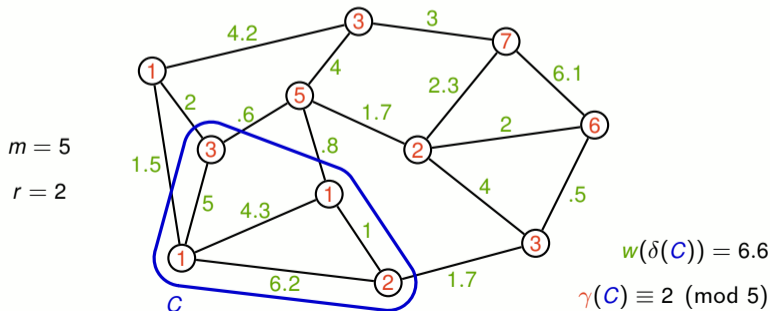


Problem Setting

Congruency-Constrained Minimum Cut Problem (CCMC)

Input: Graph $G = (V, E)$, edge weights $w: E \rightarrow \mathbb{R}_{\geq 0}$, vertex multiplicities $\gamma: V \rightarrow \mathbb{Z}_{\geq 0}$, $m \in \mathbb{Z}_{>0}$, and $r \in \mathbb{Z}_{\geq 0}$.

Goal: Find a minimizer of $\min \left\{ w(\delta(C)) \mid \begin{array}{l} \emptyset \subsetneq C \subsetneq V, \\ \sum_{v \in C} \gamma(v) \equiv r \pmod{m} \end{array} \right\}$.



Motivation and Prior Results

- ▶ Generalization of well-known cut problems:
 - ↪ Global minimum cuts, minimum s - t -cuts, minimum odd cuts.
- ▶ Integer Programming with bounded subdeterminants:

Can $\min\{c^T x \mid Ax \leq b, x \in \mathbb{Z}^n\}$ be solved efficiently if $A \in \mathbb{Z}^{m \times n}$ is m -modular?

- ↪ *Bimodular integer programming* ($m = 2$):
Reduction to parity-constrained cut and flow problems. [Artmann, Weismantel, Zenklusen, 2017]
- ↪ CCMC can be reduced to m -modular ILPs.
- ▶ Congruency-constrained submodular minimization:
 - ↪ Efficient algorithm for prime power moduli. [Nägele, Sudakov, Zenklusen, 2018]
 - ↪ Barriers for composite moduli. [Gopi, 2019]

Theorem 1: PRAS for CCMC

CCMC with constant modulus m admits a polynomial time randomized approximation scheme.

Theorem 1: PRAS for CCMC

CCMC with constant modulus m admits a polynomial time randomized approximation scheme.

- ▶ Approach inspired by **Karger's contraction algorithm**.
- ▶ Novel way of sampling vertex pairs to contract.
 - ↗ Using **splitting-off techniques** from Graph Theory.
- ▶ Combination with **approximate reduction** steps.

Our Results

Theorem 1: PRAS for CCMC

CCMC with constant modulus m admits a polynomial time randomized approximation scheme.

Theorem 2: Exact algorithm for special case

CCMC with modulus $m = pq$ for primes $p \neq q$ admits an exact polynomial time randomized algorithm.

Theorem 1: PRAS for CCMC

CCMC with constant modulus m admits a polynomial time randomized approximation scheme.

Theorem 2: Exact algorithm for special case

CCMC with modulus $m = pq$ for primes $p \neq q$ admits an exact polynomial time randomized algorithm.

Theorem 3: Structure for instances with prime moduli

Given a CCMC problem with prime modulus and nonzero optimal value denoted by OPT , there is a randomized algorithm returning polynomially many s - t cut problems such that w.h.p.,

C is solution of (CCMC) problem
with value $\leq \kappa \cdot \text{OPT}$ \iff C is solution of one of the s - t cut
problems with value $\leq \kappa \cdot \text{OPT}$.

Karger's Contraction Algorithm...

... and how to adopt it for CCMC.

Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.

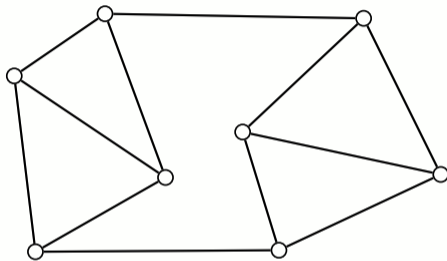
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



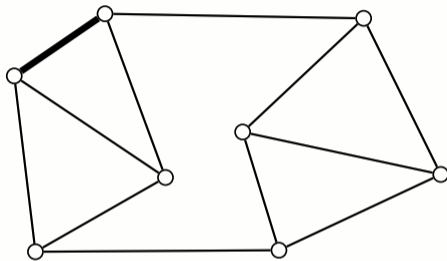
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



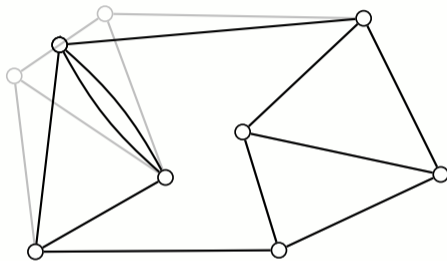
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



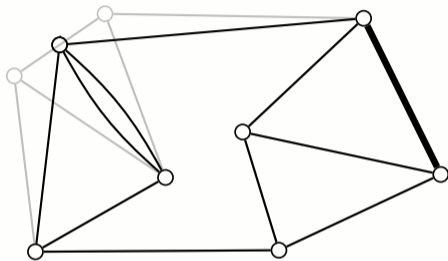
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



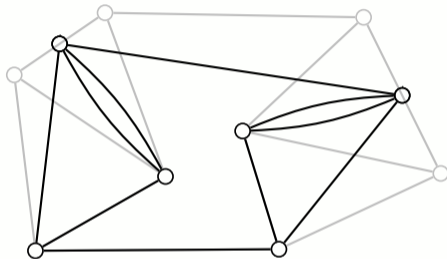
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



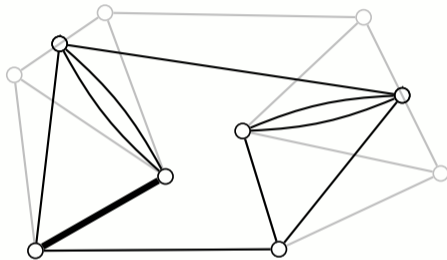
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



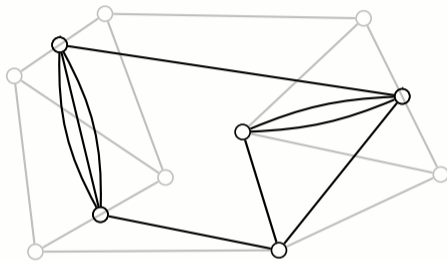
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



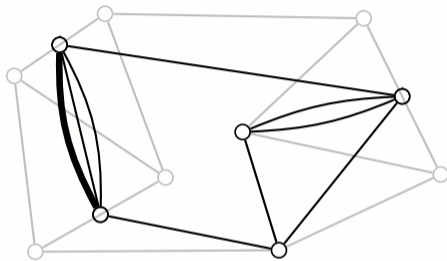
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



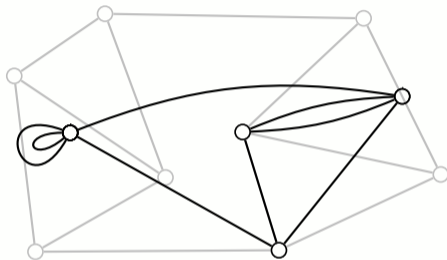
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



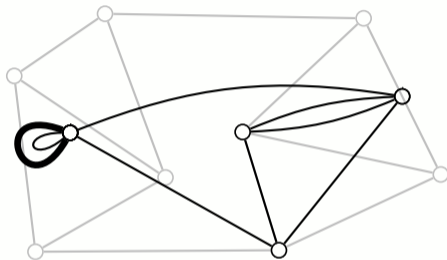
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



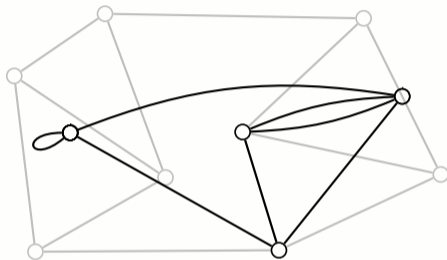
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



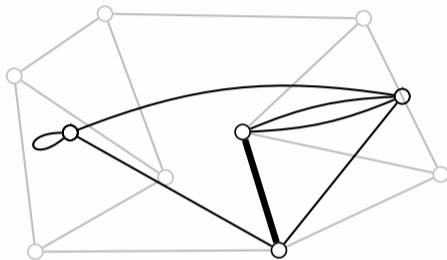
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



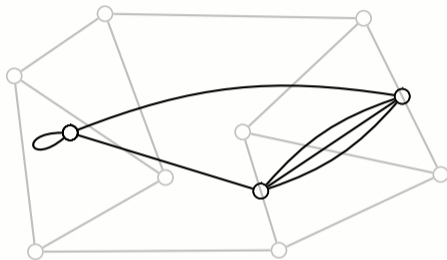
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



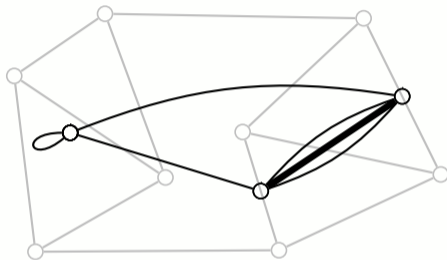
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:

 Contract a random edge.

return Cut corresponding to a remaining vertex.



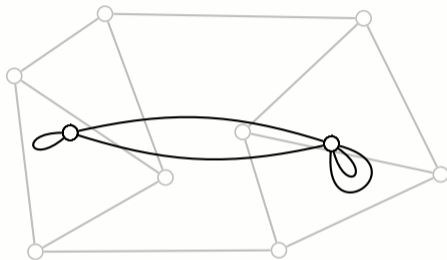
Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do:**

 Contract a random edge.

return Cut corresponding to a remaining vertex.



Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:
 Contract a random edge.
return Cut corresponding to a remaining vertex.

Analysis:

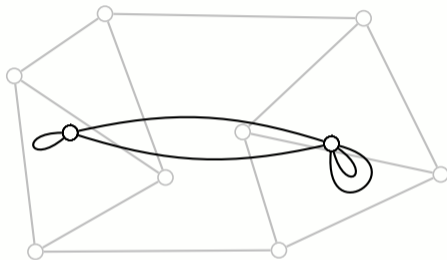
- ▶ Singletons are feasible solution candidates.

$$\implies |\delta(v)| \geq \text{OPT} .$$

- ▶ Contractions uniformly at random:

$$\Pr \left[\begin{array}{l} \text{contraction is} \\ \text{bad wrt. } C_{\text{OPT}} \end{array} \right] = \frac{\text{OPT}}{|E|} = \frac{\text{OPT}}{\frac{1}{2} \sum_{v \in V} |\delta(v)|} \leq \frac{2}{|V|}$$

$$\implies \Pr \left[\begin{array}{l} \text{no bad} \\ \text{contraction} \end{array} \right] \geq \prod_{i=3}^{|V|} \left(1 - \frac{2}{i} \right) = \Omega \left(\frac{1}{|V|^2} \right).$$



Karger's Contraction Algorithm

Algorithm

while $|V| > 2$ **do**:
 Contract a random edge.
return Cut corresponding to a remaining vertex.

Analysis:

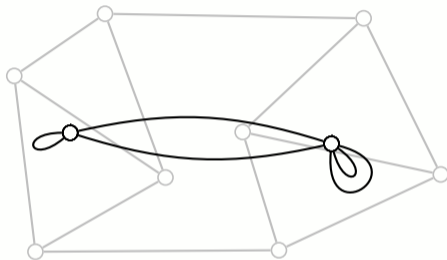
- ▶ Singletons are feasible solution candidates.

$$\implies |\delta(v)| \geq \text{OPT}.$$

- ▶ Contractions uniformly at random:

$$\Pr \left[\begin{array}{l} \text{contraction is} \\ \text{bad wrt. } C_{\text{OPT}} \end{array} \right] = \frac{\text{OPT}}{|E|} = \frac{\text{OPT}}{\frac{1}{2} \sum_{v \in V} |\delta(v)|} \leq \frac{2}{|V|}$$

$$\implies \Pr \left[\begin{array}{l} \text{no bad} \\ \text{contraction} \end{array} \right] \geq \prod_{i=3}^{|V|} \left(1 - \frac{2}{i} \right) = \Omega \left(\frac{1}{|V|^2} \right).$$

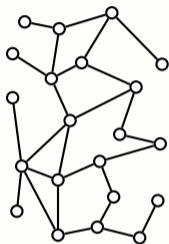


If $\sum_{v \in V} |\delta(v)| \geq \varepsilon \cdot |V| \cdot \text{OPT}$, Karger until $2/\varepsilon$ vertices remain succeeds with probability $\Omega(|V|^{-2/\varepsilon})$.

↪ Enumerate remaining options.

What fails with $\gamma(C) \equiv r \pmod{m}$?

$G = (V, E)$

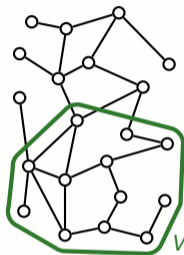


Problems:

- ▶ Singletons are generally not feasible.
- ▶ Average degree can be small.
- ▶ Edge contractions might not be enough.

What fails with $\gamma(C) \equiv r \pmod{m}$?

$G = (V, E)$

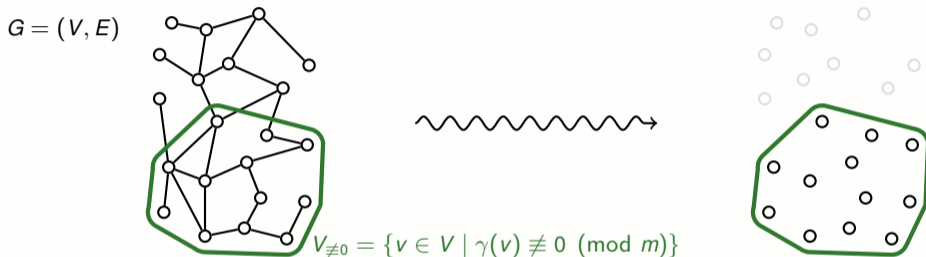


$$V_{\neq 0} = \{v \in V \mid \gamma(v) \not\equiv 0 \pmod{m}\}$$

Problems:

- ▶ Singletons are generally not feasible.
- ▶ Average degree can be small.
- ▶ Edge contractions might not be enough.

What fails with $\gamma(C) \equiv r \pmod{m}$?



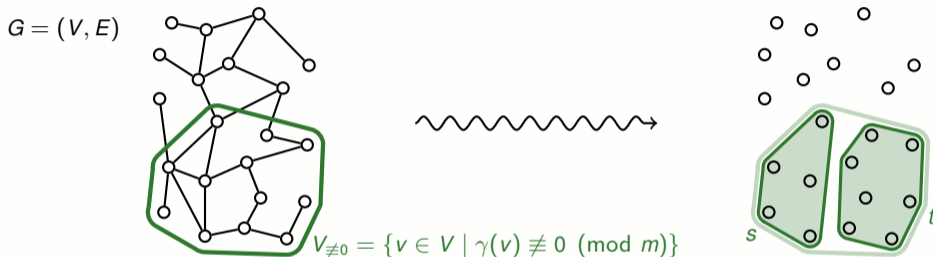
Problems:

- ▶ Singletons are generally not feasible.
- ▶ Average degree can be small.
- ▶ Edge contractions might not be enough.

Plan:

- ▶ Reduce to $V_{\neq 0}$, allow contracting arbitrary vertex pairs.
- ▶ Extend to $V \setminus V_{\neq 0}$ solving unconstrained s - t cut problem.

What fails with $\gamma(C) \equiv r \pmod{m}$?



Problems:

- ▶ Singletons are generally not feasible.
- ▶ Average degree can be small.
- ▶ Edge contractions might not be enough.

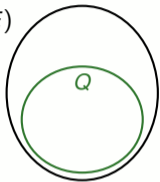
Plan:

- ▶ Reduce to $V_{\neq 0}$, allow contracting arbitrary vertex pairs.
- ▶ Extend to $V \setminus V_{\neq 0}$ solving unconstrained s - t cut problem.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]

$G = (V, E)$



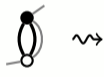
$H = (Q, F)$



- Two operations:



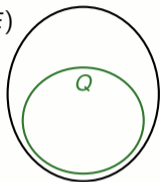
and



Splitting-Off: Auxiliary Graph Construction

- ▶ Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]

$G = (V, E)$



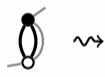
$H = (Q, F)$



- ▶ Two operations:



and



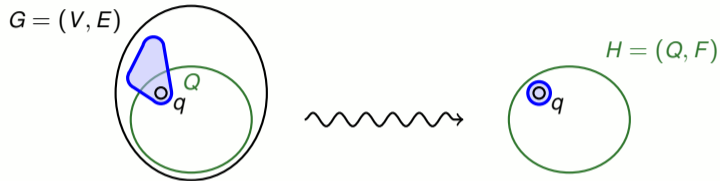
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

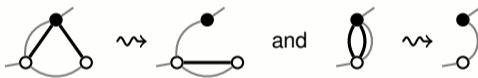
- ▶ cut values do not increase, and
- ▶ $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- ▶ Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- ▶ Two operations:



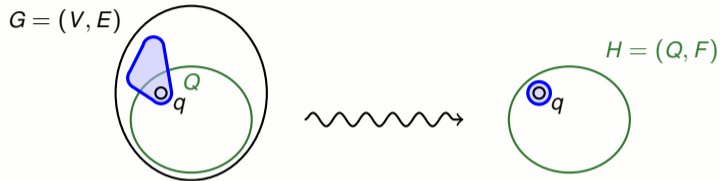
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

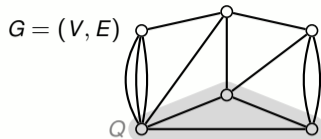
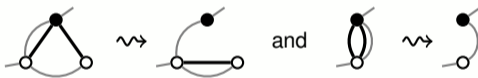
- ▶ cut values do not increase, and
- ▶ $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



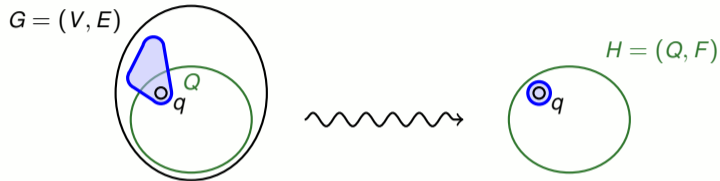
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

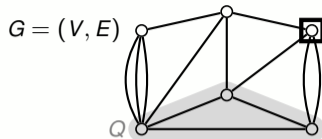
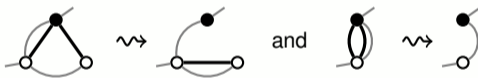
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



Theorem [Lov. 76]

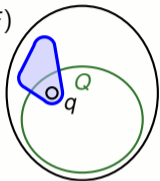
Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

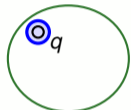
Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]

$G = (V, E)$



$H = (Q, F)$



- Two operations:



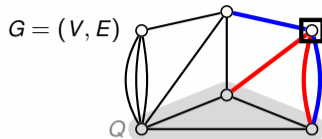
and



Theorem [Lov. 76]

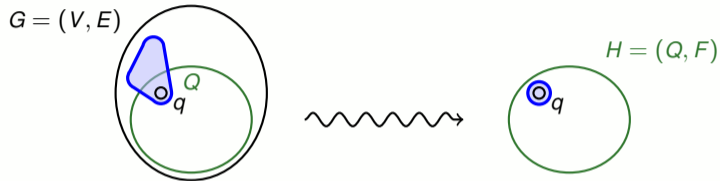
Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

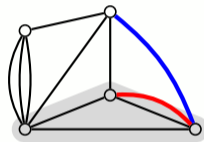
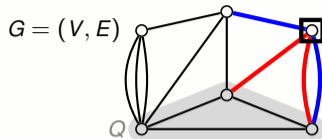
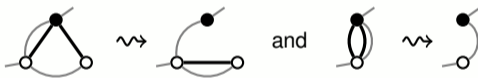


Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



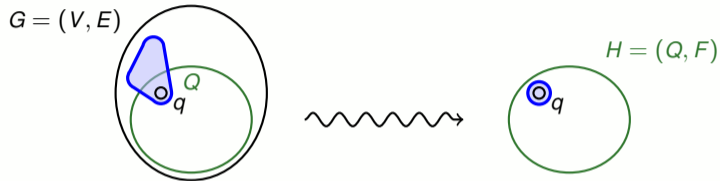
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

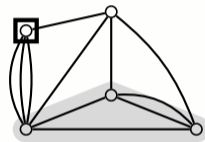
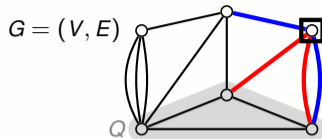
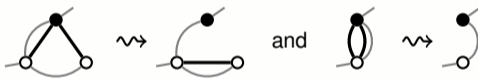
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



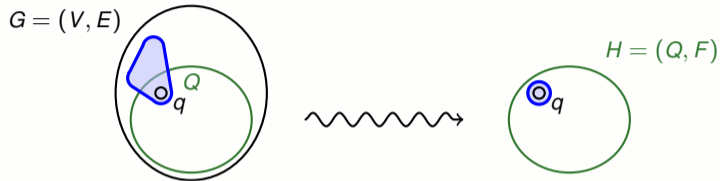
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

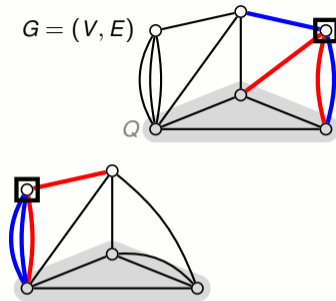
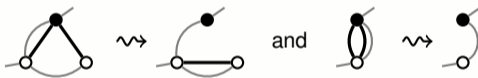
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



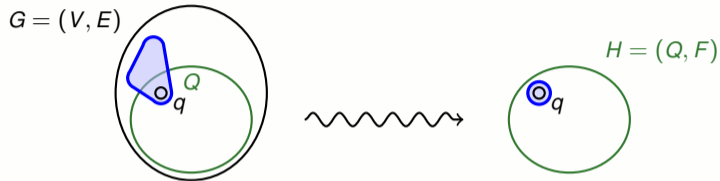
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

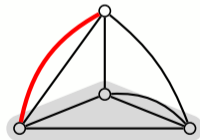
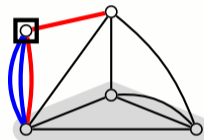
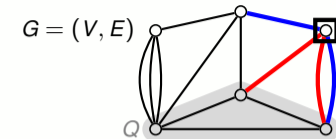
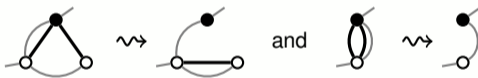
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



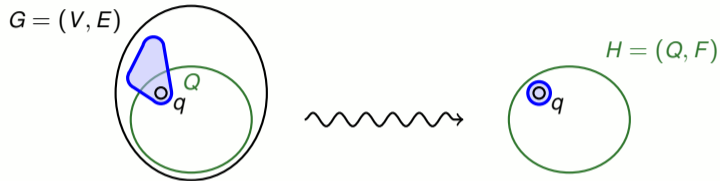
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

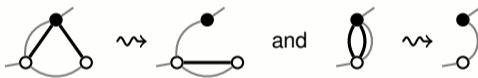
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



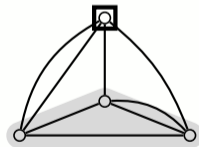
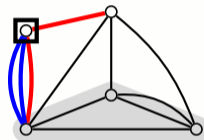
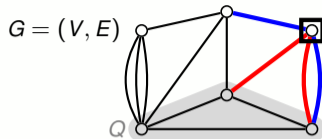
- Two operations:



Theorem [Lov. 76]

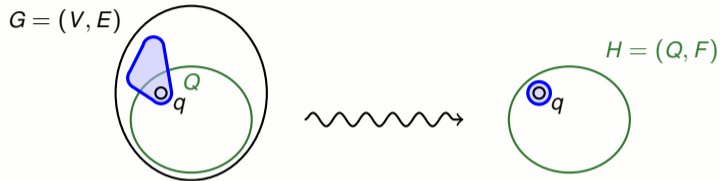
Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

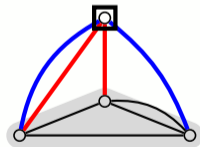
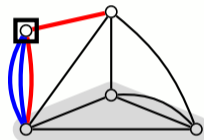
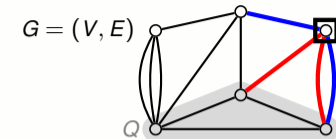
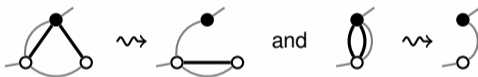


Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:



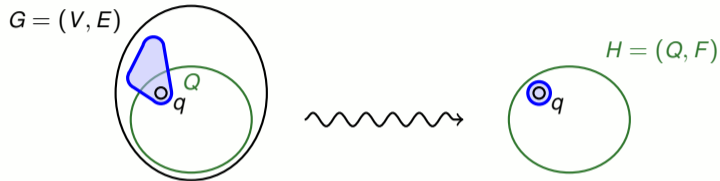
Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

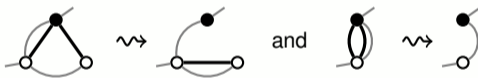
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



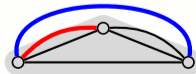
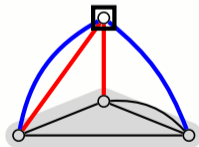
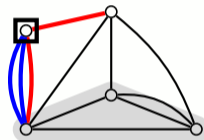
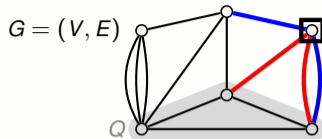
- Two operations:



Theorem [Lov. 76]

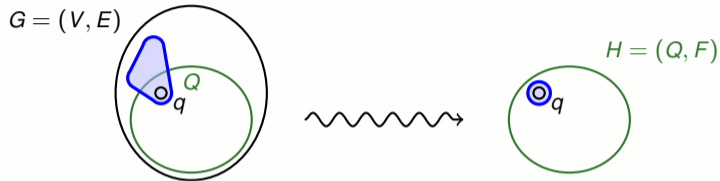
Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

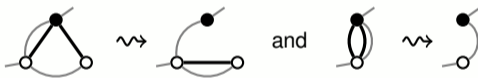


Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



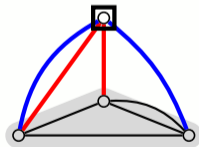
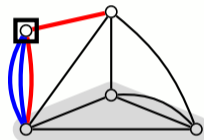
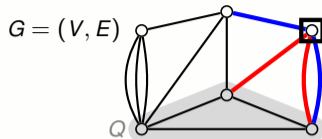
- Two operations:



Theorem [Lov. 76]

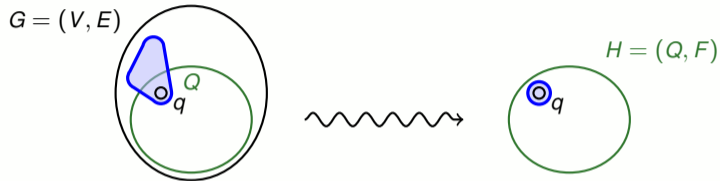
Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

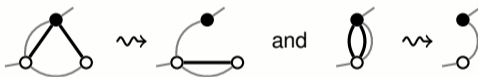


Splitting-Off: Auxiliary Graph Construction

- Fundamental technique from Graph Theory [Lovász, 1976 & 1979] [Mader, 1978]



- Two operations:

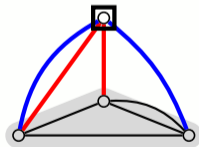
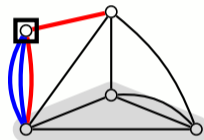
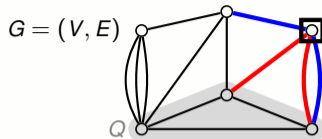


Theorem [Lov. 76]

Let G Eulerian, then edges can be split from $v \in V \setminus Q$ in pairs such that

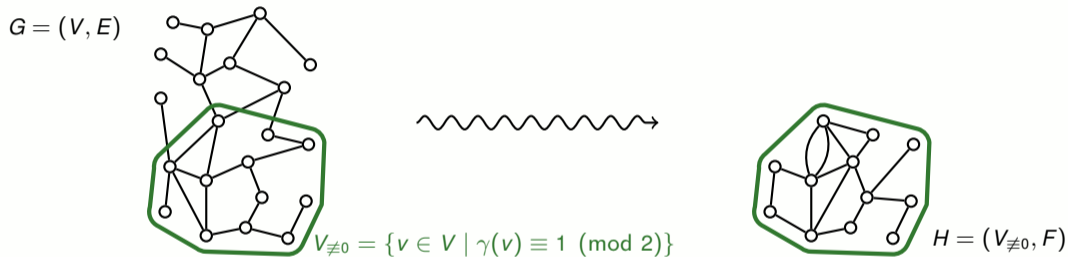
- cut values do not increase, and
- $\nu(\{q\}) := \min \left\{ |\delta_G(C)| \mid \emptyset \subsetneq C \subsetneq V, C \cap Q = \{q\} \right\}$ is preserved for all $q \in Q$.

- Weighted algorithmic version: Combination with ideas of Frank. [Frank, 1992]



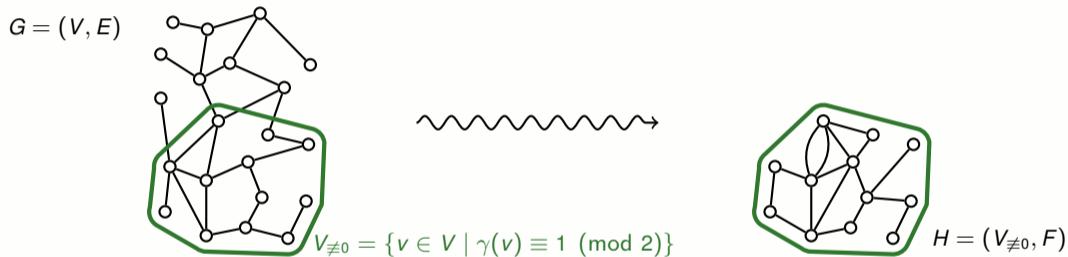
A Contraction-Approach to Odd Cuts

- ▶ CCMC with $m = 2$ and $r = 1$, i.e., constraint $\gamma(C) \equiv 1 \pmod{2}$.



A Contraction-Approach to Odd Cuts

- ▶ CCMC with $m = 2$ and $r = 1$, i.e., constraint $\gamma(C) \equiv 1 \pmod{2}$.



- ▶ Optimal cut value did not increase.

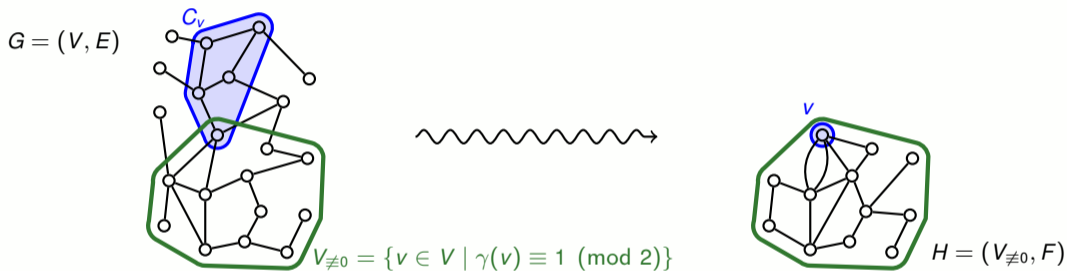
$\rightsquigarrow |\delta_H(C_{\text{OPT}} \cap V_{\neq 0})| \leq |\delta_H(C_{\text{OPT}})| = \text{OPT}.$

- ▶ Singletons in H correspond to feasible solutions.

$\rightsquigarrow |\delta_H(v)| = |\delta_G(C_v)| \geq \text{OPT}.$

A Contraction-Approach to Odd Cuts

- ▶ CCMC with $m = 2$ and $r = 1$, i.e., constraint $\gamma(C) \equiv 1 \pmod{2}$.



- ▶ Optimal cut value did not increase.

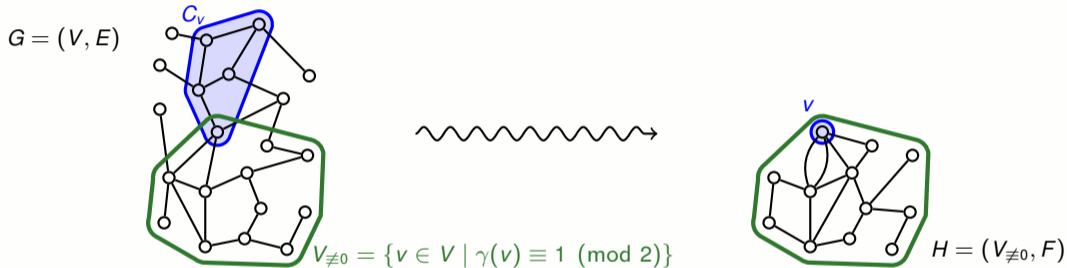
$\rightsquigarrow |\delta_H(C_{\text{OPT}} \cap V_{\neq 0})| \leq |\delta_H(C_{\text{OPT}})| = \text{OPT}.$

- ▶ Singletons in H correspond to feasible solutions.

$\rightsquigarrow |\delta_H(v)| = |\delta_G(C_v)| \geq \text{OPT}.$

A Contraction-Approach to Odd Cuts

- ▶ CCMC with $m = 2$ and $r = 1$, i.e., constraint $\gamma(C) \equiv 1 \pmod{2}$.



- ▶ Optimal cut value did not increase.

$\rightsquigarrow |\delta_H(C_{\text{OPT}} \cap V_{\neq 0})| \leq |\delta_H(C_{\text{OPT}})| = \text{OPT}.$

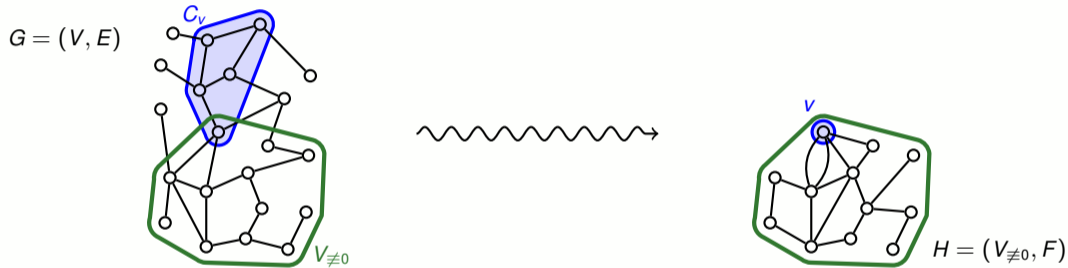
- ▶ Singletons in H correspond to feasible solutions.

$\rightsquigarrow |\delta_H(v)| = |\delta_G(C_v)| \geq \text{OPT}.$

\implies Karger-type analysis with respect to $V_{\neq 0}$ works!

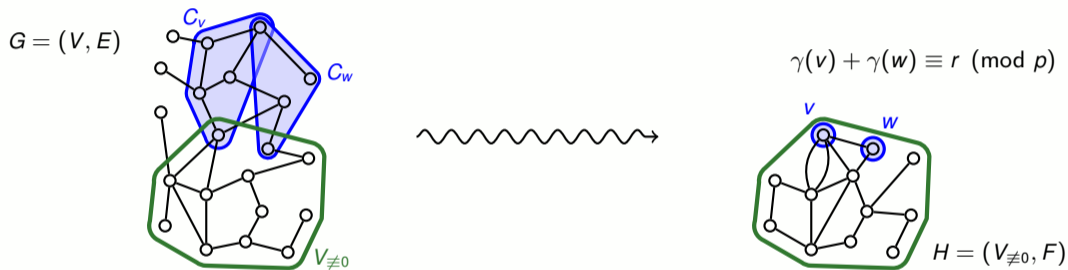
CCMC with Prime Modulus p

- **Issue:** Singletons in H do not necessarily correspond to cuts with $\gamma(C) \equiv r \pmod{p}$.



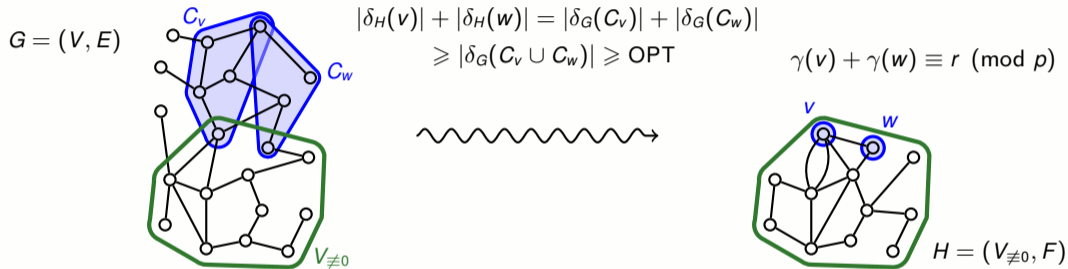
CCMC with Prime Modulus p

- **Issue:** Singletons in H do not necessarily correspond to cuts with $\gamma(C) \equiv r \pmod{p}$.



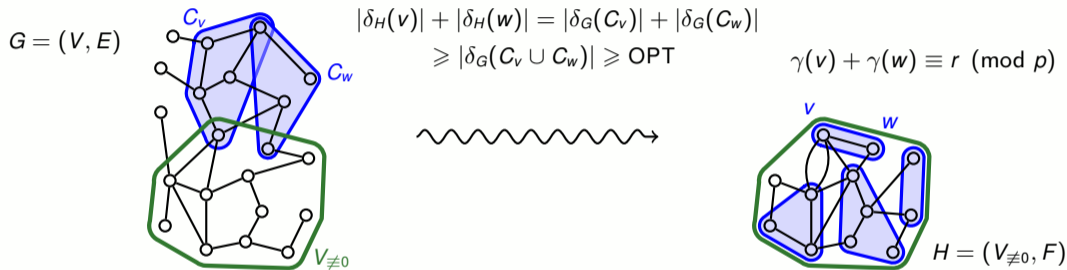
CCMC with Prime Modulus p

- **Issue:** Singletons in H do not necessarily correspond to cuts with $\gamma(C) \equiv r \pmod{p}$.



CCMC with Prime Modulus p

- **Issue:** Singletons in H do not necessarily correspond to cuts with $\gamma(C) \equiv r \pmod{p}$.

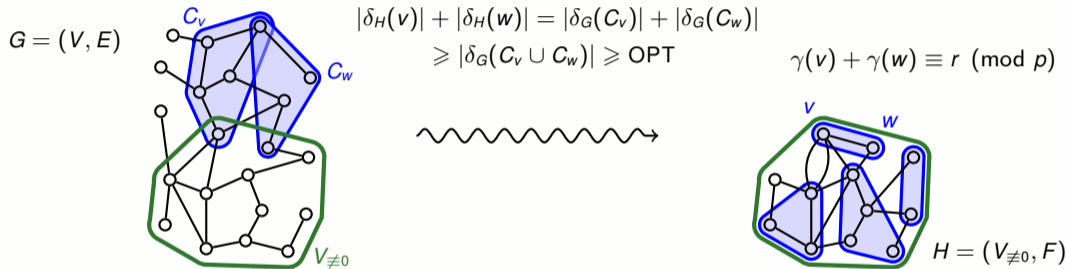


Thm. **(Cauchy-Davenport)** Among any p nonzero elements of $\mathbb{Z}/p\mathbb{Z}$, there is a subset summing to $r \pmod{p}$.

- Combine singletons to $\frac{1}{p}|V_{\neq 0}|$ many feasible sets.
- ~~~~~> $\sum_{v \in V_{\neq 0}} |\delta_H(v)| \geq \frac{1}{p} \cdot |V_{\neq 0}| \cdot \text{OPT}.$

CCMC with Prime Modulus p

- **Issue:** Singletons in H do not necessarily correspond to cuts with $\gamma(C) \equiv r \pmod{p}$.



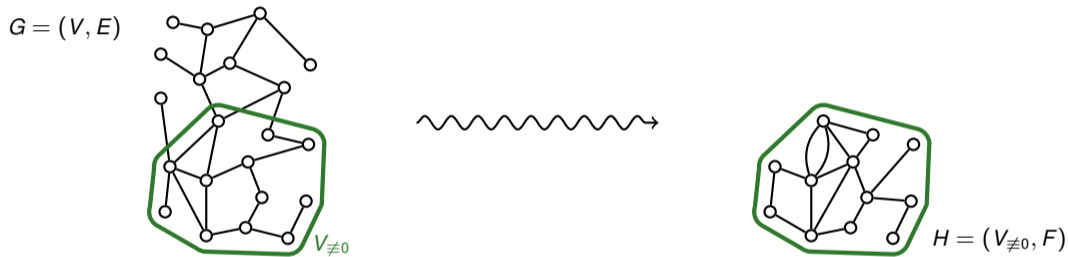
Thm. (Cauchy-Davenport) Among any p nonzero elements of $\mathbb{Z}/p\mathbb{Z}$, there is a subset summing to $r \pmod{p}$.

- Combine singletons to $\frac{1}{p}|V_{\neq 0}|$ many feasible sets.
 $\rightsquigarrow \sum_{v \in V_{\neq 0}} |\delta_H(v)| \geq \frac{1}{p} \cdot |V_{\neq 0}| \cdot \text{OPT}.$

\implies Karger-type average-degree analysis with respect to $V_{\neq 0}$ works!

The General Case: Reduction Steps

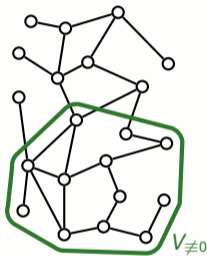
- **Issue:** We might have $\sum_{v \in V_{\neq 0}} |\delta_H(v)| < \epsilon \cdot |V_{\neq 0}| \cdot \text{OPT}$.



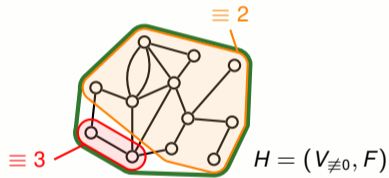
The General Case: Reduction Steps

- **Issue:** We might have $\sum_{v \in V_{\neq 0}} |\delta_H(v)| < \epsilon \cdot |V_{\neq 0}| \cdot \text{OPT}$.

$G = (V, E)$

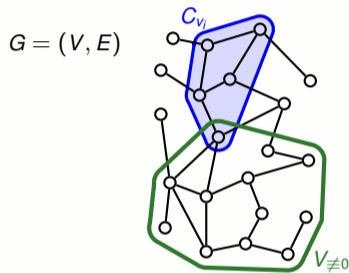


Example problem:
 $\gamma(C) \equiv 5 \pmod{6}$

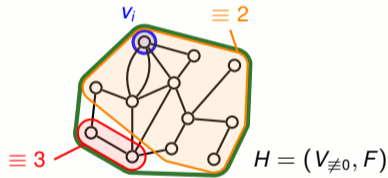


The General Case: Reduction Steps

- **Issue:** We might have $\sum_{v \in V_{\neq 0}} |\delta_H(v)| < \epsilon \cdot |V_{\neq 0}| \cdot \text{OPT}$.



Example problem:
 $\gamma(C) \equiv 5 \pmod{6}$



- There is $q \in [m-1]$ and many vertices $v_i \in V_{\neq 0}$ with

$$|\delta_H(v_i)| < 2\epsilon \text{ OPT}$$

and $\gamma(v_i) \equiv q \pmod{m}$.

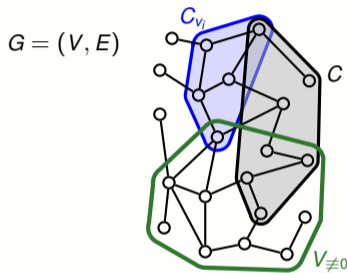
- For any cut C , we get

$$|\delta_G(C \Delta C_{v_i})| < |\delta_G(C)| + 2\epsilon \text{ OPT}$$

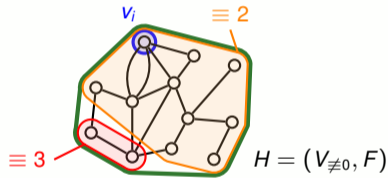
and $\gamma(C \Delta C_{v_i}) \equiv \gamma(C) \pm q \pmod{m}$.

The General Case: Reduction Steps

- **Issue:** We might have $\sum_{v \in V_{\neq 0}} |\delta_H(v)| < \epsilon \cdot |V_{\neq 0}| \cdot \text{OPT}$.



Example problem:
 $\gamma(C) \equiv 5 \pmod{6}$



- There is $q \in [m-1]$ and many vertices $v_i \in V_{\neq 0}$ with

$$|\delta_H(v_i)| < 2\epsilon \text{ OPT}$$

and $\gamma(v_i) \equiv q \pmod{m}$.

- For any cut C , we get

$$|\delta_G(C \Delta C_{v_i})| < |\delta_G(C)| + 2\epsilon \text{ OPT}$$

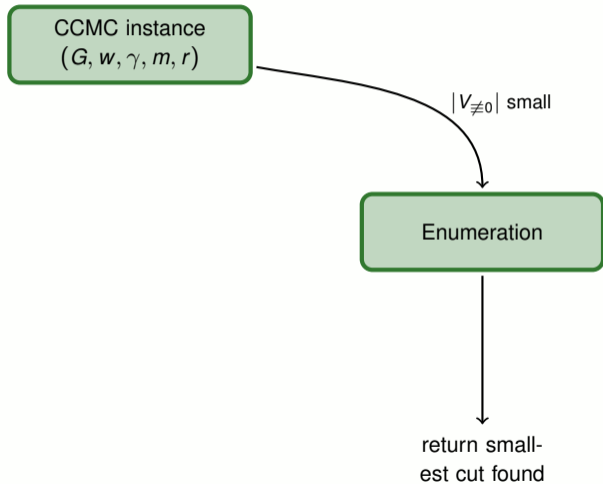
and $\gamma(C \Delta C_{v_i}) \equiv \gamma(C) \pm q \pmod{m}$.

⇒ Cheap residue correction by multiples of q —leaves problem modulo $\text{gcd}(m, q)$.

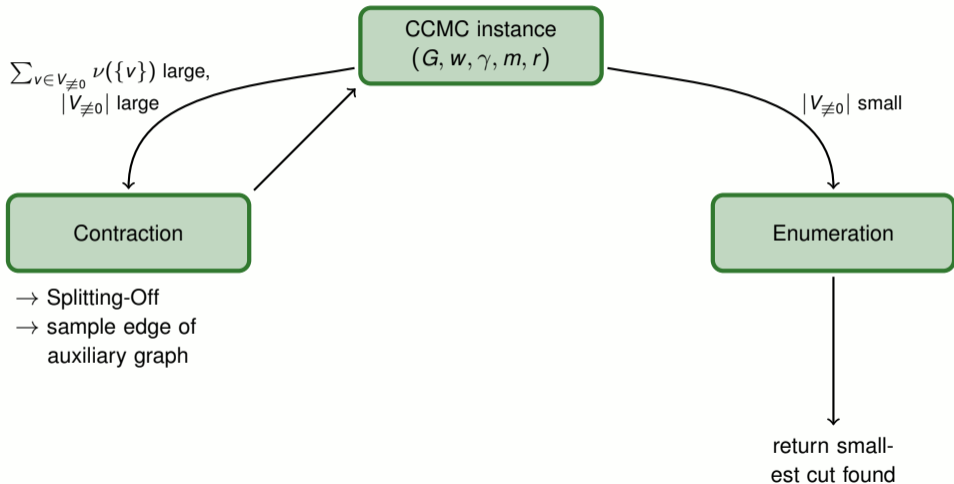
The Complete Algorithm

CCMC instance
 (G, w, γ, m, r)

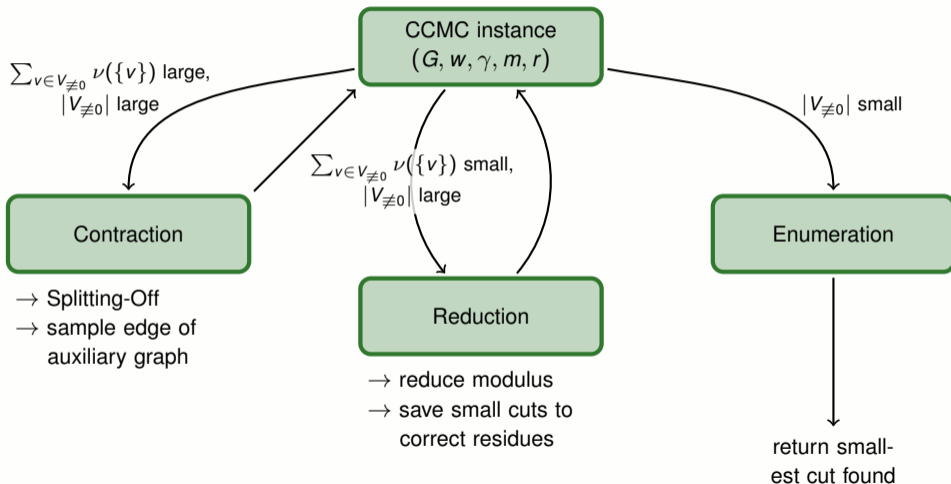
The Complete Algorithm



The Complete Algorithm



The Complete Algorithm



The Complete Algorithm

