# Beyond the Butterfly - A Graph-Theoretic Characterization for Network Coding with Two Simple Unicast Sessions 

Chih-Chun Wang and Ness B. Shroff
School of Electrical \& Computer Engineering Purdue University

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The grail structure


Q: Network coding solutions $\Leftrightarrow$ ???

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- The setting
- The main results \& corollaries
- The proofs


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- Network coding with two simple unicasts
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- The main results \& corollaries
- The proofs
- Applications on distributed rate control algorithms.


## Special Graphs w. Known Cap.

- Directed Cycles [1]
$\sum \quad r_{i} \leq c(e)$
$i$ separated by $e$



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 three-layer networks [2]
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- Capacity inner bound (suff. condition, achievability):
- The modified flow conditions + Linear programming.
- Butterfly-based construction [Traskov et al. 06], pollution-treatment [Wu 06].


## The Main Theorem

- Setting: General finite directed acyclic graphs, unit edge capacity, $\left(s_{1}, t_{1}\right) \&\left(s_{2}, t_{2}\right)$, two integer symbols $X_{1}$ and $X_{2}$.
- Number of Coinciding Paths of edge $e: \mathcal{P}=\left\{P_{1}, \cdots, P_{k}\right\}$, and $\operatorname{ncp}_{\mathcal{P}}(e)=|\{P \in \mathcal{P}: e \in P\}|$.


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Theorem 1 Network coding $\Longleftrightarrow$ one of the following two holds.

1. $\exists \mathcal{P}=\left\{P_{s_{1}, t_{1}}, P_{s_{2}, t_{2}}\right\}$, such that

$$
\max _{e \in E} \operatorname{ncp}_{\mathcal{P}}(e) \leq 1
$$

2. $\exists \mathcal{P}=\left\{P_{s_{1}, t_{1}}, P_{s_{2}, t_{2}}, P_{s_{2}, t_{1}}\right\}$ and $\mathcal{Q}=\left\{Q_{s_{1}, t_{1}}, Q_{s_{2}, t_{2}}, Q_{s_{1}, t_{2}}\right\}$ s.t. $\max _{e \in E} \operatorname{ncp}_{\mathcal{P}}(e) \leq 2$ and $\max _{e \in E} \operatorname{ncp}_{\mathcal{Q}}(e) \leq 2$.

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Routing: edge disjointness vs. Network coding: controlled overlaps.

## Feasible Example: The Butterfly



## Feasible Example 2: The Grail



## Infeasible Examples

$$
\mathcal{Q}=\left\{Q_{s_{1}, t_{1}}, Q_{s_{2}, t_{2}}, Q_{s_{1}, t_{2}}\right\}
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Proof: By the subgraph homeomorphism algorithm for directed acyclic graphs [Fortune et al. 79]
- A network coding solution needs to use at most six paths.
- Linear network coding is sufficient, a byproduct of the proof.


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Use the result in [Fragouli et al. 06] that $\left(s_{1}, m_{1}\right)$ and $\left(s_{2}, m_{2}\right)$ must form two EDPs or a butterfly.


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Assume a linear network coding solution exists.
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Arbitrarily pick $P_{s_{1}, t_{1}}^{(0)}$ and $P_{s_{2}, t_{1}}^{(0)}$.

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\begin{aligned}
\forall l, \text { if }\{ & \left.P_{s_{1}, t_{1}}^{(l)}, P_{s_{2}, t_{1}}^{(l)}, P_{s_{2}, t_{2}}\right\} \text { is not good, then construct } \\
& P_{s_{1}, t_{1}}^{(l+1)} \text { and } P_{s_{2}, t_{1}}^{(l+1)} \text { from } P_{s_{1}, t_{1}}^{(l)} \text { and } P_{s_{2}, t_{1}}^{(l)} .
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$l \leftarrow l+1$. By the finiteness of $G$, the iteration will halt.

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How about non-linear network coding? exists.
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Assume $\left\{P_{s_{1}, t_{1}}, P_{s_{2}, t_{2}}, P_{s_{2}, t_{1}}\right\}$ and $\left\{Q_{s_{1}, t_{1}}, Q_{s_{2}, t_{2}}, Q_{s_{1}, t_{2}}\right\}$
$\Rightarrow$ Construct a network coding solution.
A two-staged, add-up-\&-reset construction

1. The random add-up stage:

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A two Random add-up:
(a) If all $M_{\text {IN }}$ messages are identical, then $M_{e}=M_{\mathrm{IN}}$.
(b) Otherwise $M_{e}=a_{1} M_{1}+\cdots+a_{m} M_{m}$ for $a_{i}>0$, such that $M_{e}$ is linearly indep. of any other messages $M_{e^{\prime}}$ for those $e^{\prime}$ not in the downstream of $e$.


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Assume $\left\{P_{s_{1}, t_{1}}, P_{s_{2}, t_{2}}, P_{s_{2}, t_{1}}\right\}$ and $\left\{Q_{s_{1}, t_{1}}, Q_{s_{2}, t_{2}}, Q_{s_{1}, t_{2}}\right\}{ }_{S_{1}}^{S_{1}}$
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- Controlled overlap condition $\Rightarrow$ the feasibility.


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$$
\begin{aligned}
& \left.\operatorname{ncp}_{\left\{P_{s_{1}, t_{1}}, P_{s_{2}, t_{1}}, Q_{s_{1}, t_{1}}\right.}\right\}(e)=3, \\
& \operatorname{ncp}_{\left\{P_{s_{1}, t_{1}}, P_{s_{2}, t_{1}}, P_{s_{2}, t_{2}}\right\}}(e)=2,
\end{aligned}
$$

$\Longrightarrow e \notin P_{s_{2}, t_{2}}$
$\Longrightarrow$ Messages along $P_{s_{2}, t_{2}}$ are not affected.
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## Improved Capacity Region

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- The capacity region is strictly improved.


## Capacity Region (Cont'd)

- Pattern-based construction vs. path-based construction


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- Pattern-based construction vs. path-based construction

- $\left(s_{1}, t_{1}\right): 1$ path, $\left(s_{2}, t_{2}\right): 3$ paths, $\left(s_{3}, t_{3}\right): 4$ paths, $\left(s_{1}, t_{2}\right): 3$ paths, $\quad\left(s_{2}, t_{3}\right): 5$ paths, $\quad\left(s_{1}, t_{3}\right): 2$ paths $\left(s_{2}, t_{1}\right): 3$ paths, $\quad\left(s_{3}, t_{2}\right): 1$ path, $\quad\left(s_{3}, t_{1}\right): 3$ paths.


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- $\left(s_{1}, t_{1}\right): 1$ path, $\left(s_{2}, t_{2}\right): 3$ paths, $\left(s_{3}, t_{3}\right): 4$ paths, $\left(s_{1}, t_{2}\right): 3$ paths, $\quad\left(s_{2}, t_{3}\right): 5$ paths, $\quad\left(s_{1}, t_{3}\right): 2$ paths $\left(s_{2}, t_{1}\right): 3$ paths, $\quad\left(s_{3}, t_{2}\right): 1$ path, $\left(s_{3}, t_{1}\right): 3$ paths.
- Bottleneck identification for all path combinations.


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- Pattern-based construction vs. path-based construction

- 

Distributed path-based network optimization with arbitrary utility function. [Submitted to Infocom 08]

- Bottleneck identification for all path combinations.


## Other implications

- The network-sharing bound in [Yan et al. 06]
- Cut-based outer bound for K-pair unicasts.
- Relabel the subscripts of $\left(s_{i}, t_{i}\right)$ according to an arbitrary permutation.
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Corollary 1 The network-sharing bound is tight. Namely, if the network-sharing bound is $\geq 2$ for all permutation and for all cuts, then network coding is feasible.


## Discussion

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- Applicable to general directed acyclic graphs,
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- It can be generalized to two simple multicast sessions [submitted to Allerton 07]
Send $X_{1}$ and $X_{2}$ along $\left(s_{1},\left\{t_{1, i}\right\}\right)$ and $\left(s_{2},\left\{t_{2, j}\right\}\right)$ where $\left\{t_{1, i}\right\} \cap\left\{t_{2, j}\right\} \neq \varnothing$.

