

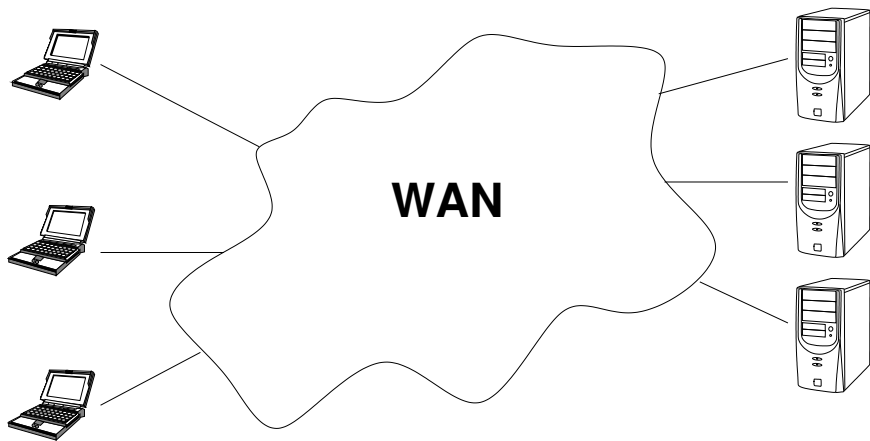
# Matrix Factorizations for Computer Networks

David Bindel

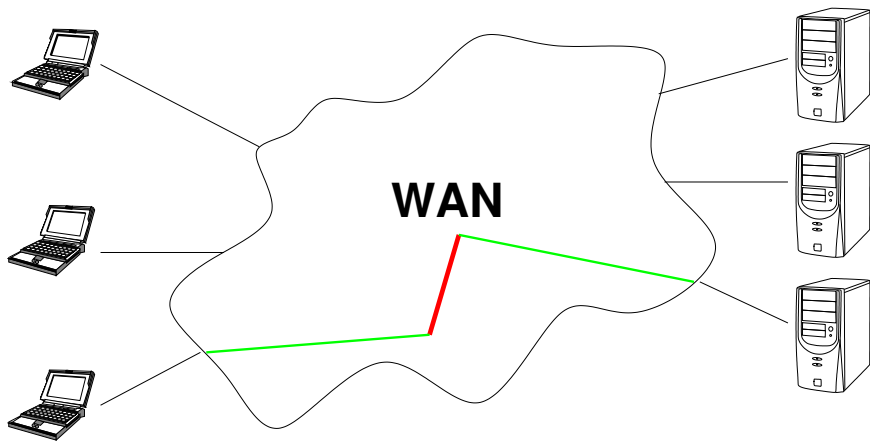
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30 Apr 2011

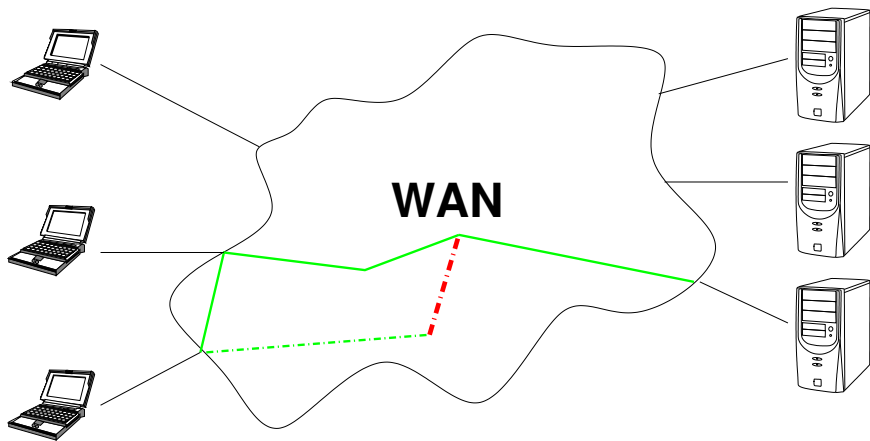
# A fuzzy picture of the Internet



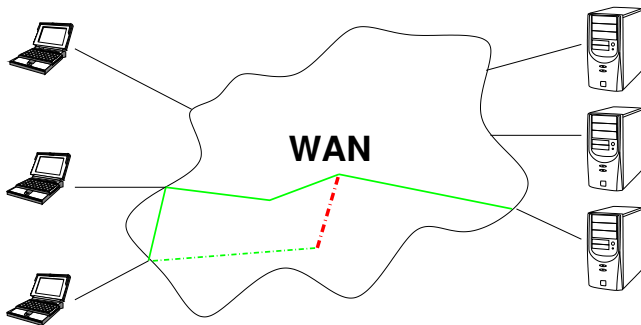
# A slightly-less fuzzy picture



# Overlays to the rescue?



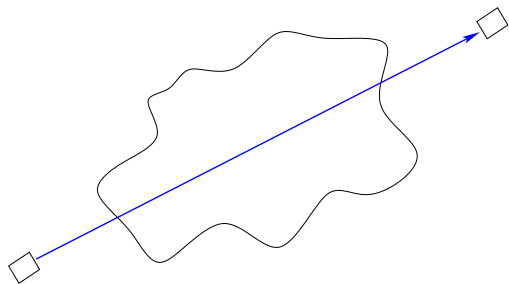
# Overlays and measurement



Measure a few paths to infer:

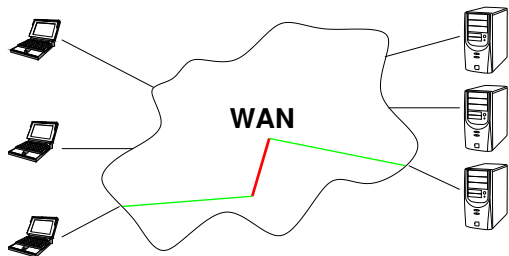
- *Path* properties (ToN 2007, SIGCOMM 2004, IMC 2003)
- *Link* properties (ToN 2009, SIGCOMM 2006)
- Routing topology? (underway)

# Discrete Radon transform



Radon transform:

$$(Ru)(L) = \int_L u(\mathbf{x}) |d\mathbf{x}|$$



Discrete version:

$$(Gu)_i = \sum_{j \in \text{links}(i)} u_j$$

# Path metrics and path matrices

Relate path and link properties via a linear map:

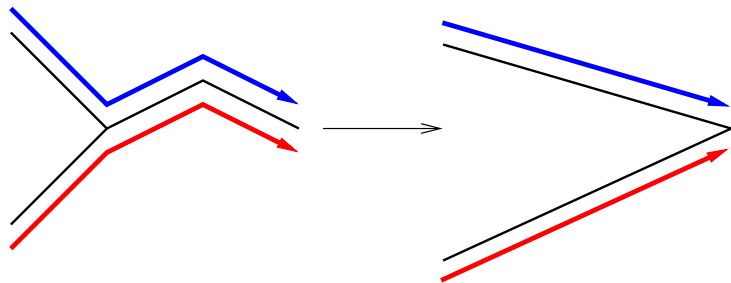
$$Gu = b$$

where

- $b_i$  = property of  $i$ th end-to-end path
- $u_j$  = property of link  $j$
- $G_{ij} = \begin{cases} 1 & \text{if path } i \text{ uses link } j \\ 0 & \text{otherwise} \end{cases}$

Wanted: a sparse rank-revealing factorization of  $G$

# Network virtualization and column dependencies



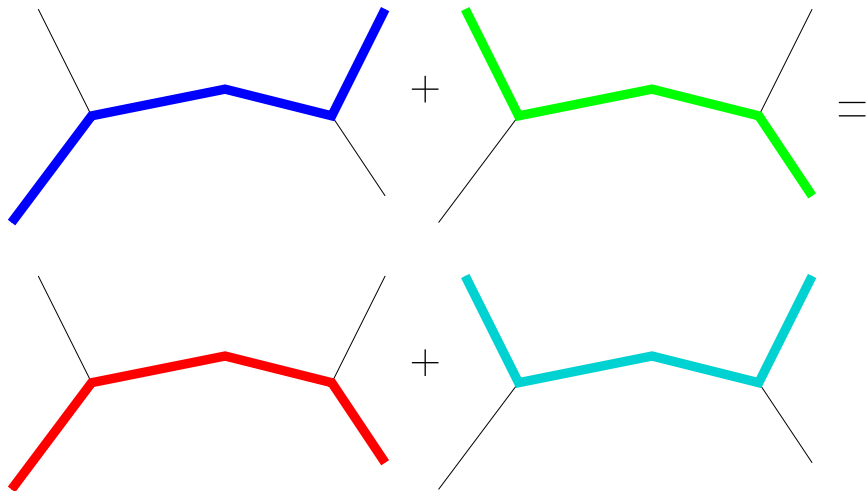
“Fans” == structured linear dependency among columns (links):

$$G(:, \text{fan}) = [c_1 \quad c_2 \quad c_1 + c_2 \quad c_1 + c_2] = [c_1 \quad c_2] \begin{bmatrix} 1 & 0 & 1 & 1 \\ 0 & 1 & 1 & 1 \end{bmatrix}$$

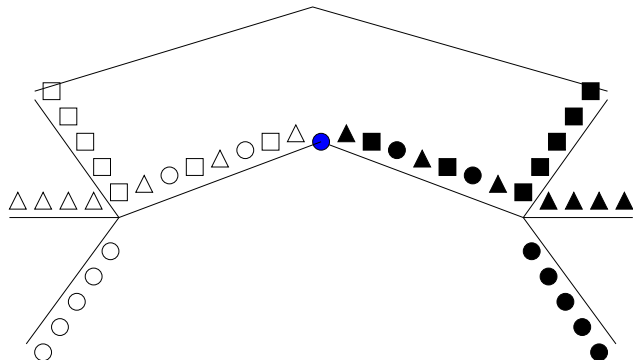
Factor out a zero-one “virtualization matrix.”



# Row dependencies and dependent paths



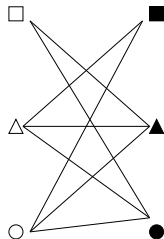
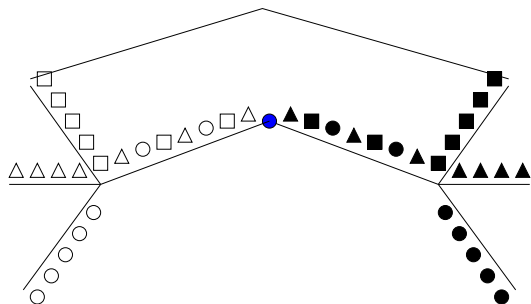
# More complicated linear dependencies?



Linear dependencies

$$\begin{array}{r} \square + \blacktriangle \\ - \quad \triangle + \blacktriangle \\ + \quad \triangle + \bullet \\ \hline = \quad \square + \bullet \end{array}$$

# Junctions and bipartite graphs



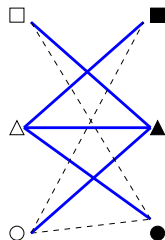
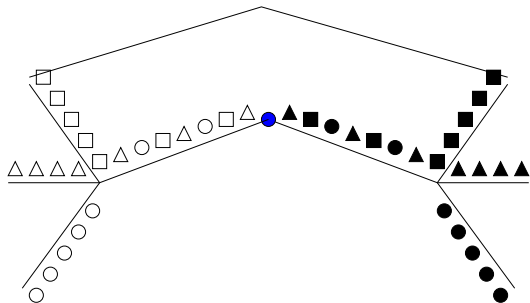
*Bipartite router graph at  $r$ :*

Left node = segment from source  $\rightarrow r$

Right node = segments  $r \rightarrow$  destination

Edge = path traversing  $r$

# Junctions and bipartite graphs



Spanning trees in the router graph  
 $\implies$   
spanning sets among path vectors

## On network tomography:

- Chen, B., Song, Chavez, Katz. *Algebra-based scalable overlay network monitoring: Algorithms, evaluation, and applications*. ACM ToN, 17(6), 2009.
- Zhao, Chen, B. *Towards unbiased end-to-end network diagnosis*. ACM ToN, 15(5), 2007
- <http://www.cs.cornell.edu/~bindel>
- ... or come talk to me!

## On completely different things:

- Micro-machined wineglass gyroscopes (Erdal Yilmaz)
- Resonances and nonlinear eigenvalue problems (Amanda Hood)