

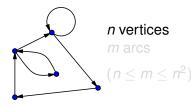


# Asymptotic enumeration of sparse strongly connected digraphs by vertices and edges

Xavier Pérez Giménez, Nicholas C. Wormald

Graphs @ Ryerson Seminar

Toronto, November, 2012



#### How many?

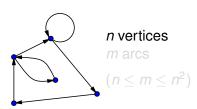
#### Some old results:

■ Moon, Moser '66: Almost all  $2^{n^2}$  digraphs on n vertices are strongly connected (2-paths)





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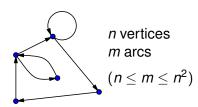


- Moon, Moser '66: Almost all  $2^{n^2}$  digraphs on *n* vertices are strongly connected (2-paths)
- Palásti '66: If  $m = \lfloor n \log n + \alpha n \rfloor$  for fixed  $\alpha$ , then  $\Pr(\text{strongly connected}) \to \exp(-2e^{-\alpha})$ .
- Wright '77: Recurrences for the exact number, for m n = O(1)





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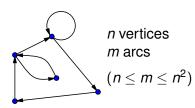


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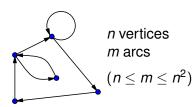


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#### Theorem (Cooper, Frieze '04):

Asymptotic formula for  $\mathbf{Pr}$ (strongly connected) for a fixed 'nice' degree sequence and  $(1 + \epsilon)n \le m = O(n)$ .

#### Theorem (Pittel '12 / PG, Wormald '12):

The number of strongly connected digraphs is

$$\sim \frac{(m-1)!(e^{\lambda}-1)^{2n}}{2\pi(1+\lambda-m/n)\lambda^{2m}}\exp(-\lambda^2/2)\frac{e^{\lambda}(e^{\lambda}-1-\lambda)^2}{(e^{2\lambda}-e^{\lambda}-\lambda)(e^{\lambda}-1)},$$

where  $\lambda$  is determined by  $m/n = \lambda e^{\lambda}/(e^{\lambda} - 1)$ .

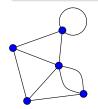
- For m = O(n) and  $m n \gg n^{2/3}$ . Explicit error estimates.
- For  $m = O(n \log n)$  and  $m n \to \infty$ . Also loop-free case.

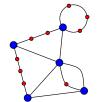


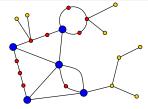


### Similar problems

- Bender, Canfield, McKay '90 / Pittel, Wormald '05 / van der Hofstad, Spencer '06: Number of connected graphs with n vertices and m edges
- Kemkes, Sato, Wormald '12: Number of 2-connected graphs with n vertices and m edges
- What about 3-connected graphs? Easy







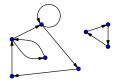




#### **Dicores**

$$(k^+, k^-)$$
-dicore:

min outdegree 
$$\geq k^+$$
; min indegree  $\geq k^-$  dicore = (1, 1)-dicore



#### Theorem (PG,Wormald '12):

For  $m = O(n \log n)$  such that  $m - n \to \infty$ ,

the number of dicores is 
$$\sim \frac{(m-1)!(e^{\lambda}-1)^{2n}}{2\pi(1+\lambda-m/n)\lambda^{2m}}\exp(-\lambda^2/2)$$

Extension to  $(k^+, k^-)$ -dicores for fixed  $k^+, k^- \in \mathbb{Z}^+$ 

It suffices to estimate the probability that a dicore is strongly connected!

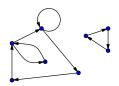




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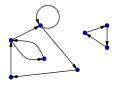




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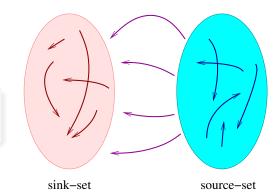


#### Sink-sets and source-sets

strongly connected

⇔

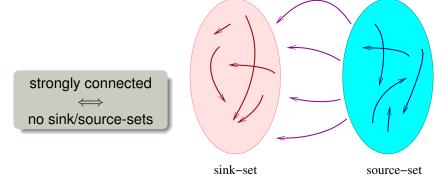
no sink/source-sets







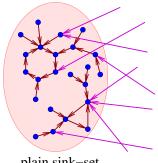
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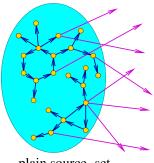




## Plain and complex sink/source-sets





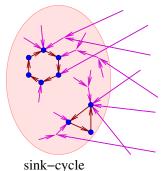


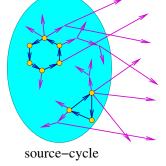
plain source-set





## Plain and complex sink/source-sets



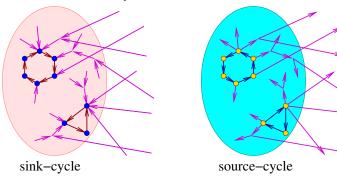


strongly connected  $\iff$ no sink/source-cycle &
no complex sink/source-set of  $\leq$ 





## Plain and complex sink/source-sets



strongly connected  $\iff$  no sink/source-cycle & no complex sink/source-set of  $\leq m/2$  arcs





Out-degree and in-degree sequences:

$$\vec{d} = (d^+, d^-), \quad d^+ = (d_1^+, \dots, d_n^+), \quad d^- = (d_1^-, \dots, d_n^-)$$

$$\mathbf{Pr}(Y=k) = \begin{cases} \frac{1}{e^{\lambda}-1} \frac{\lambda^k}{k!} & \text{if } k \ge 1\\ 0 & \text{if } k = 0 \end{cases}, \quad \mathbf{E}Y = \frac{\lambda e^{\lambda}}{e^{\lambda}-1} = \frac{m}{n}$$

- Condition on sum:  $\sum_{i=1}^{n} d_i^+ = \sum_{i=1}^{n} d_i^- = m$
- Pairing model  $\mathcal{P}(\vec{d})$
- Condition on event 'Simple' (no multiple arcs)







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### Structure of the argument

- $m/n \rightarrow c \in (1, \infty)$ 
  - 'Small' complex sink/source-sets: analysis of a BFS algorithm
  - Sink/source-cycles: computation of moments
- $m/n \rightarrow 1 \ (m-n \rightarrow \infty)$ 
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- $m/n \rightarrow \infty$   $(m/n = O(\log n))$ 
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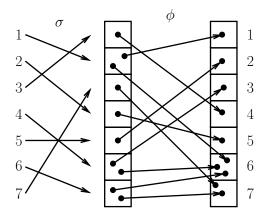


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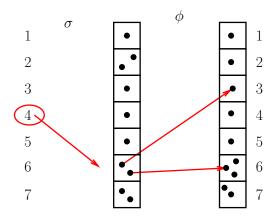






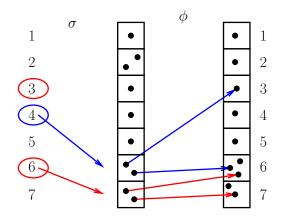








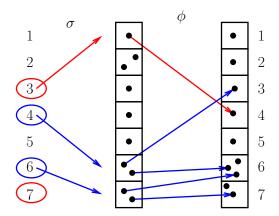






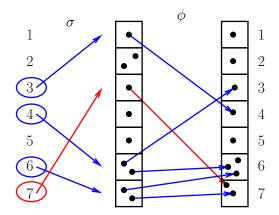






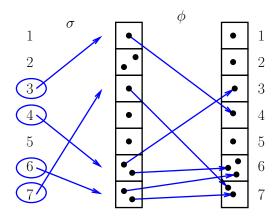






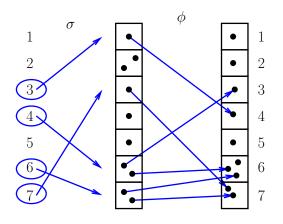












no 'small' complex sink/source-sets!







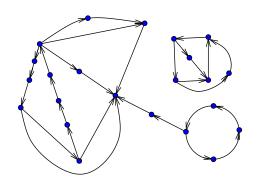
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#### Heart model

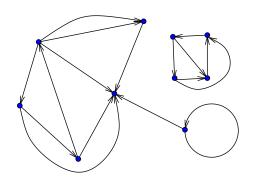




$$n' = |\{i : \delta_i + d_i \ge 3\}|$$
  
 $m' = m - n + n'$ 



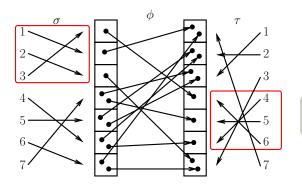
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A.a.s. no sink/source-sets of size  $1 \le s \le n/2$ .

Case  $1 \le s \le (m/n)^K$  (switching argument):



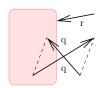


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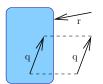
$$\xrightarrow{\geq (m/2)^q} \longleftrightarrow (r+q)^q$$





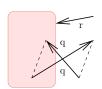
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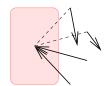
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$$\frac{\geq (m/2)^q}{\leq (r+q)^q}$$













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Case  $(m/n)^K \le s \le n/2$ :





#### Further work

Study the structure of the strongly connected component in the supercritical phase of the evolution of the random digraph.





## Thank you!



