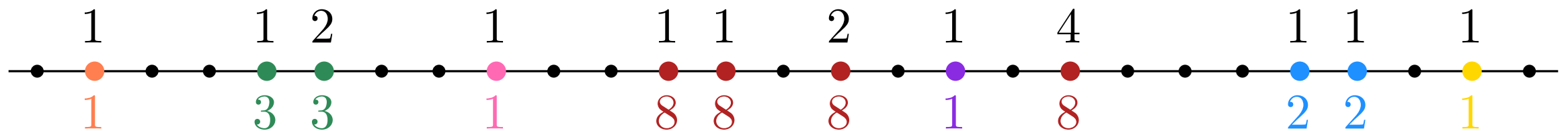
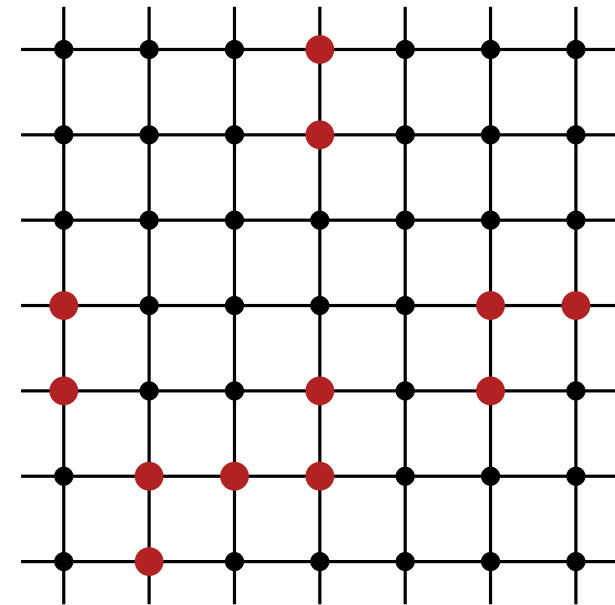
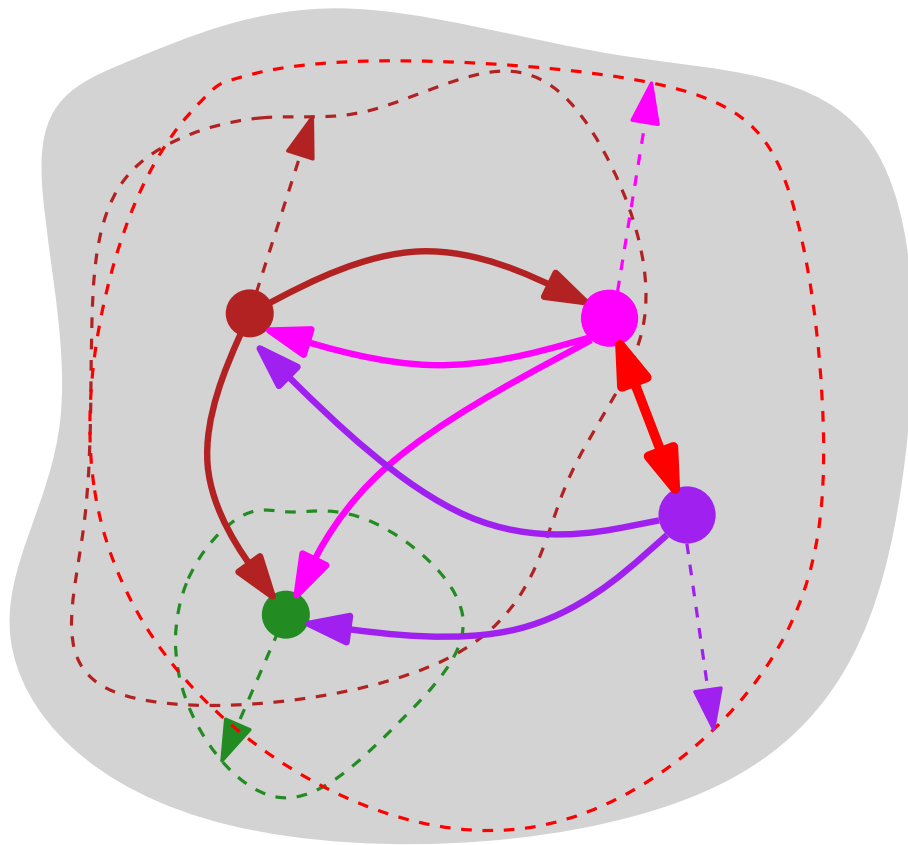


Percolation by cumulative merging and phase transition of the contact process

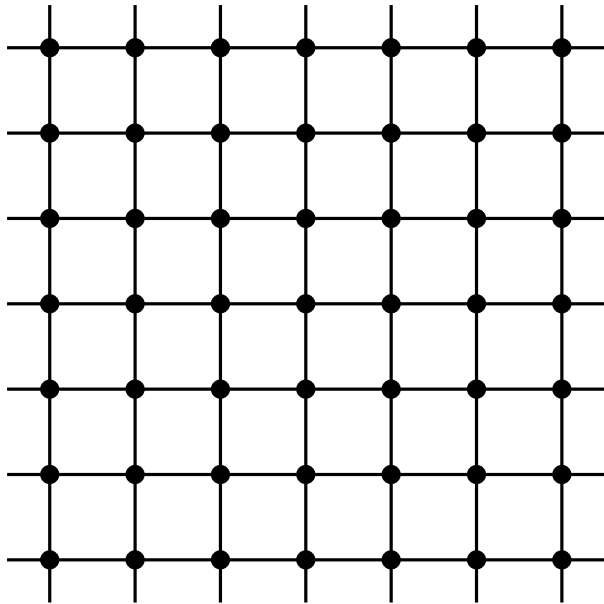
Laurent Ménard (Modal'X)

joint work with **Arvind Singh** (Orsay)



The contact process (Susceptible-Infected-Susceptible)

Epidemic model on graphs introduced by [Harris 74]

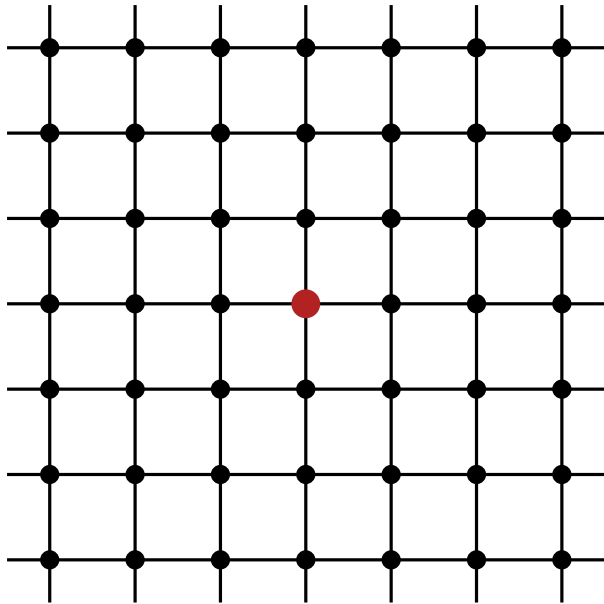


$G = (V, E)$ locally finite graph, $\lambda > 0$.

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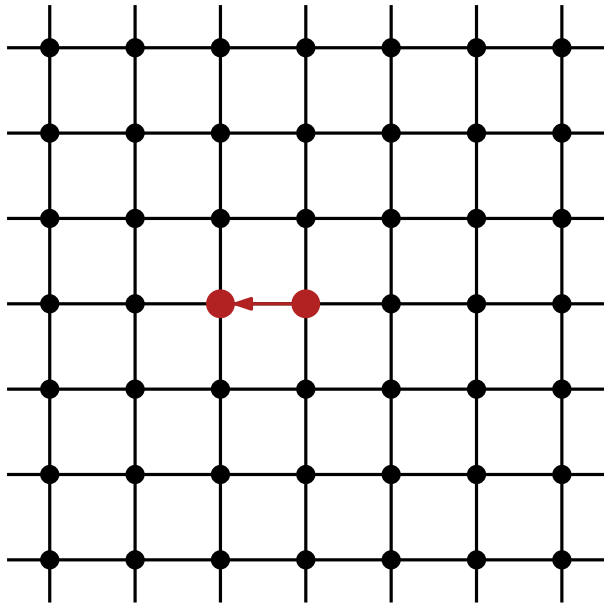


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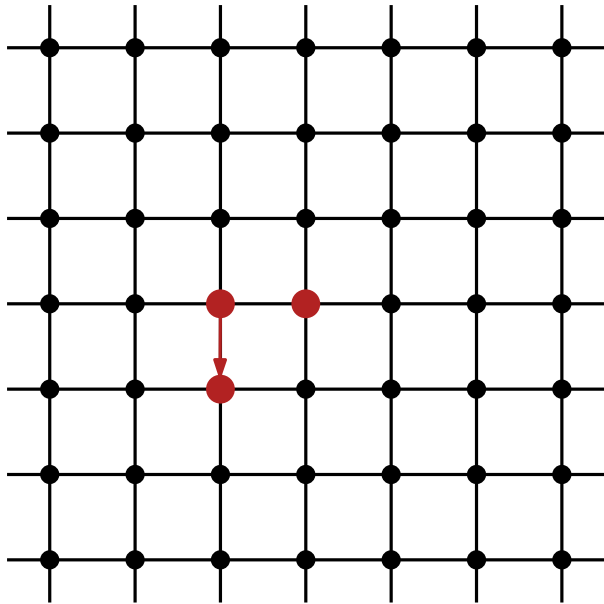


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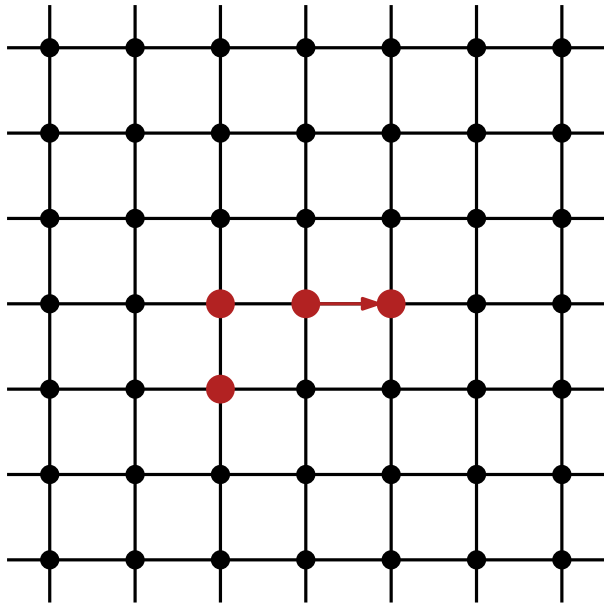


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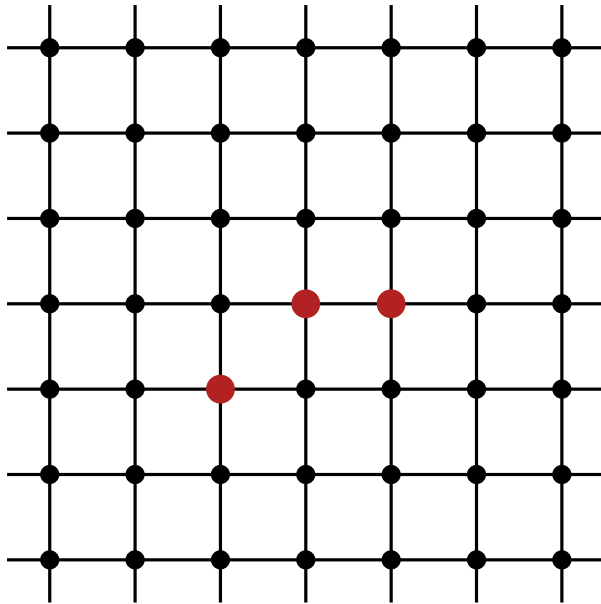


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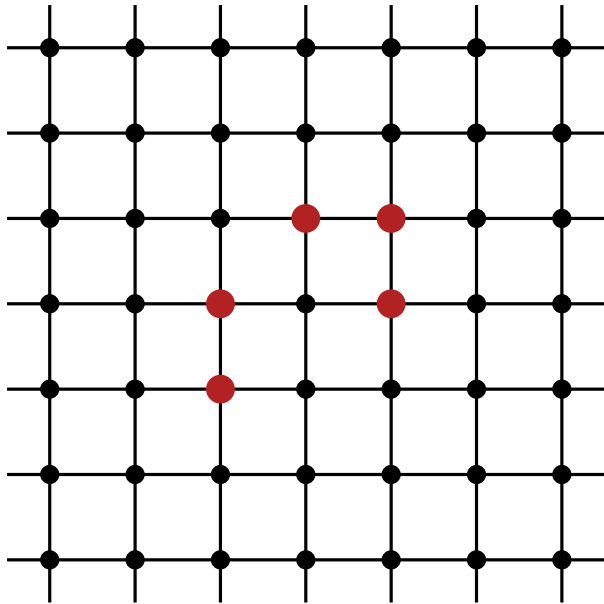


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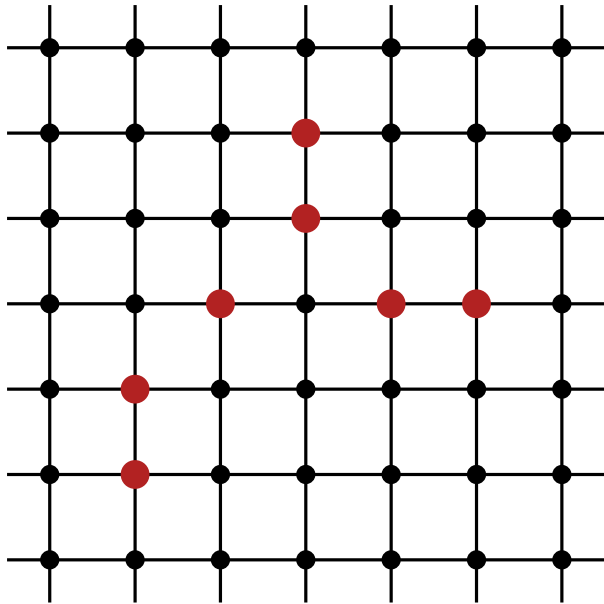


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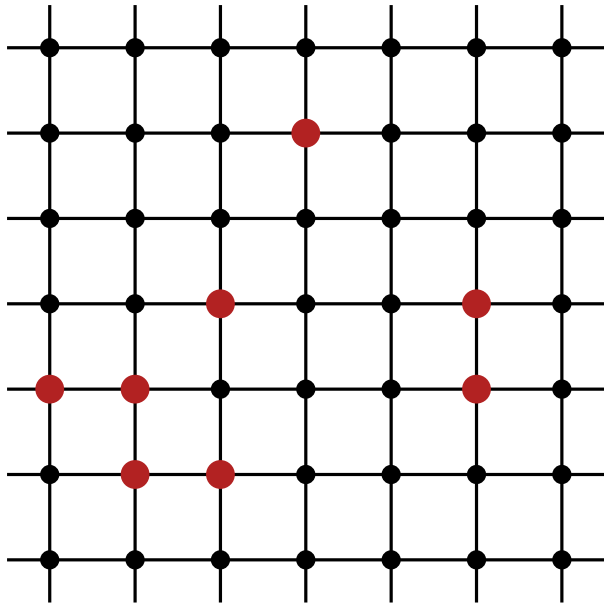


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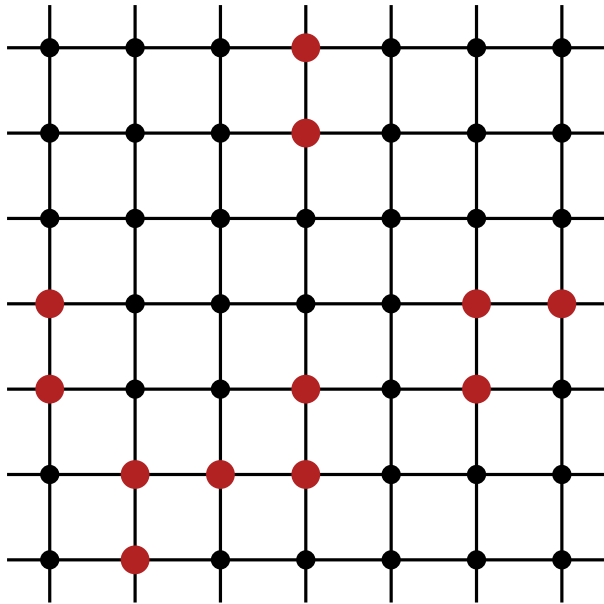
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On an infinite graph, **phase transition**: there is $\lambda_c \in [0, \infty[$ such that

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Question: condition on G to ensure $\lambda_c > 0$?

The contact process on a graph with bounded degrees

If G has **bounded** degrees, then $\lambda_c > 0$.

Compare with **branching random walk**:

- **No interaction** between particles;
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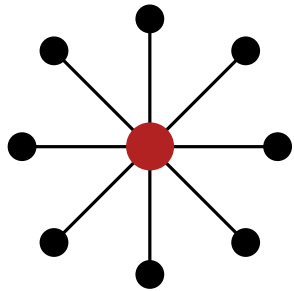
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Comparison gives nothing for graphs with **unbounded** degrees: BRW survives locally on large degree star-graphs.

- No other method to prove that contact process dies out.
- No example of graph with unbounded degrees for which we know $\lambda_c > 0$.

Heuristics for the contact process

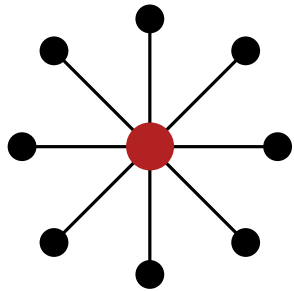
Contact process on a star graph of large degree d :



- start with only ● infected.
- If $\lambda > \lambda_c(d)$, survival time of the process is $\approx \exp(d)$.

Heuristics for the contact process

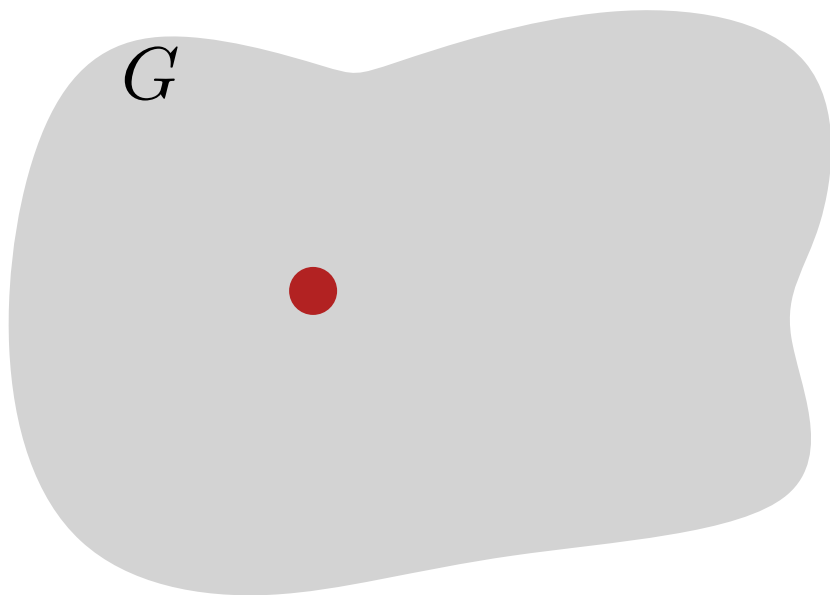
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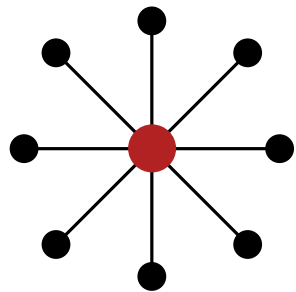
Now fix $\lambda > 0$ and consider contact process on a graph G s.t.

- One vertex (\bullet) has large degree d_0 with $\lambda > \lambda_c(d_0)$;
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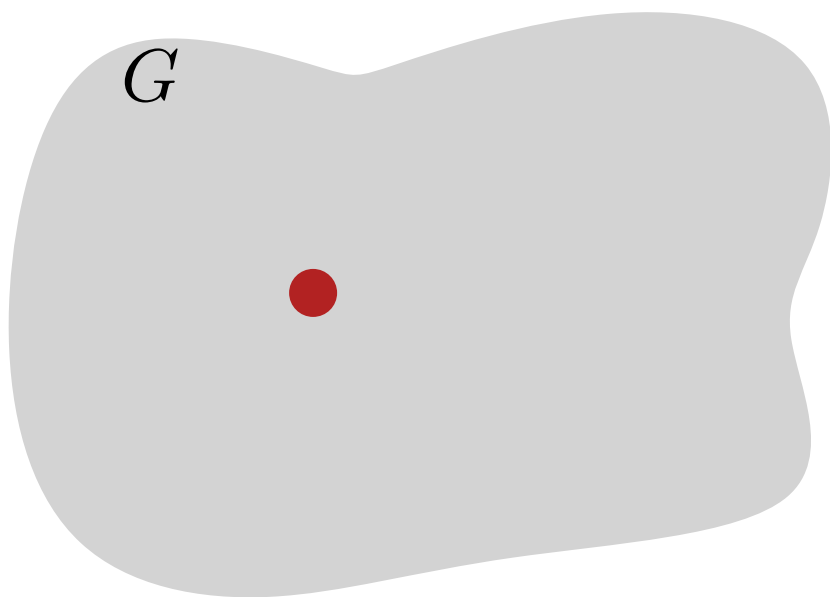
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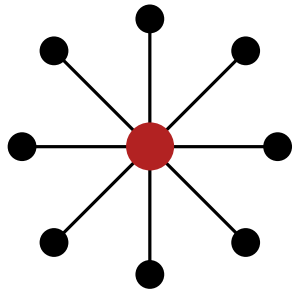
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- Start with only ● infected.
- Force ● to stay infected a time $\exp(d_0)$.
- After that time, force the whole star around ● to recover.

Heuristics for the contact process

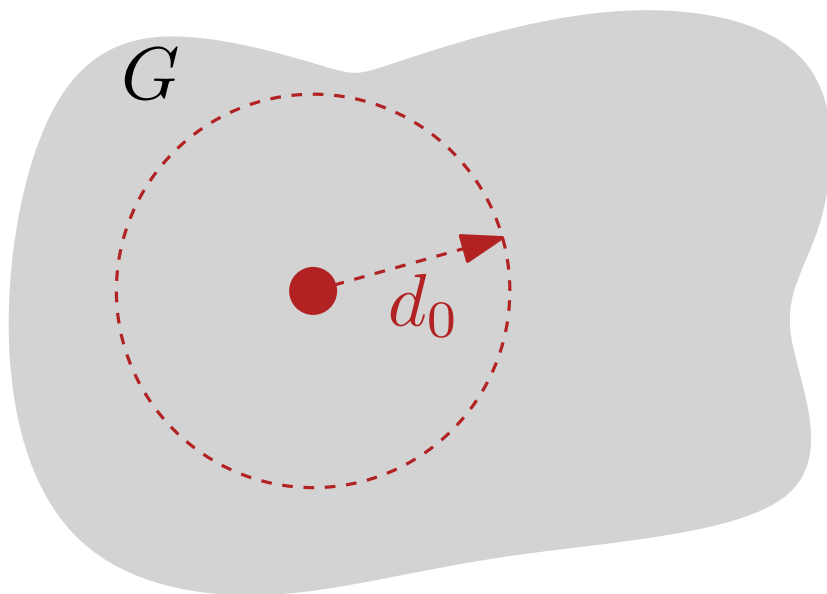
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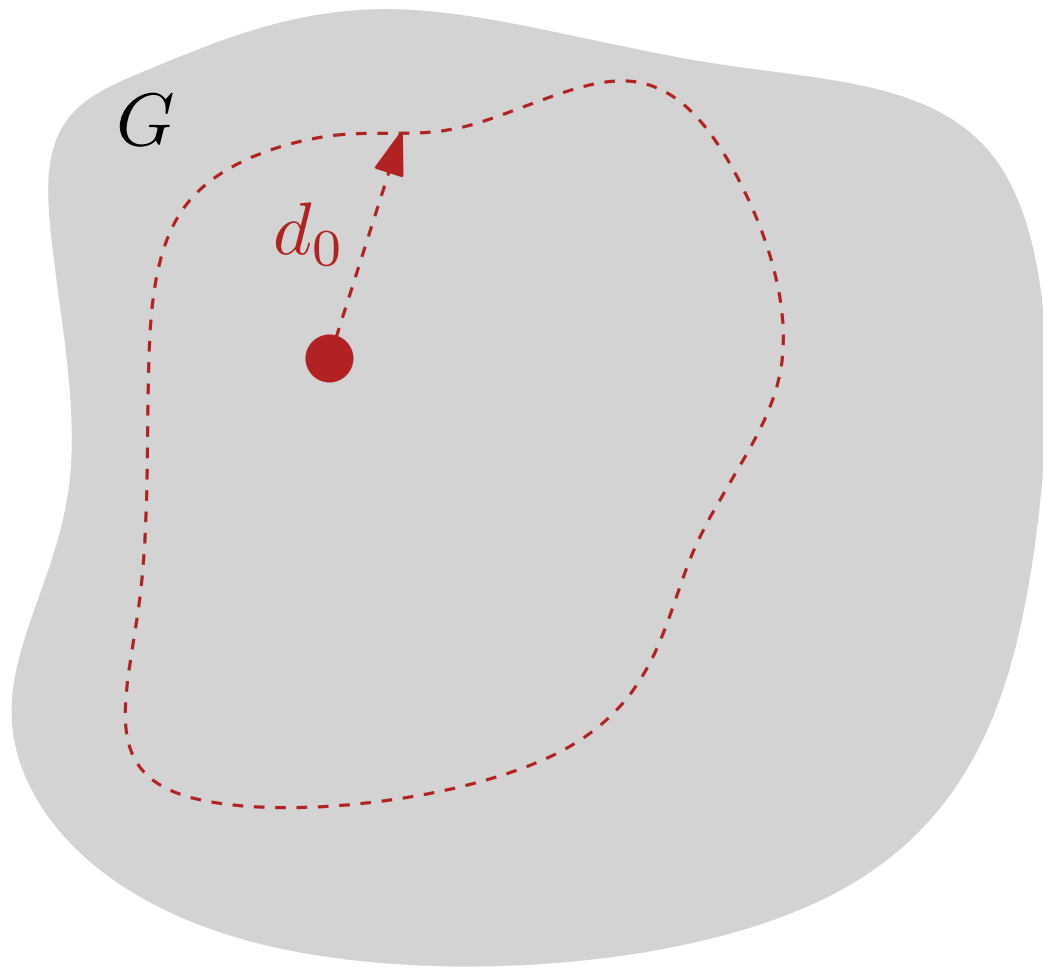


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Maximal distance reached by infection is $\approx d_0$.

Heuristics for the contact process

Same as before for ● and start of the infection.

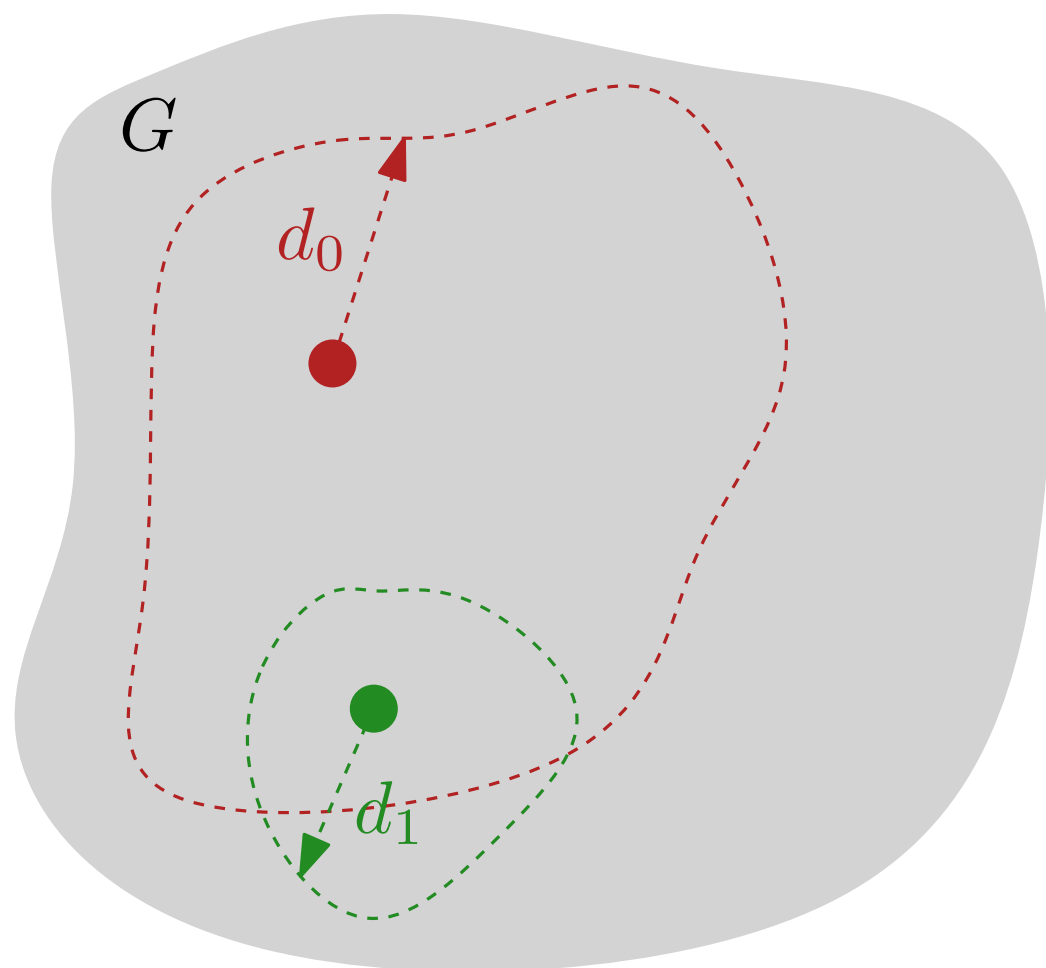


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In addition suppose:

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- Suppose also $d_1 \ll d_0$.

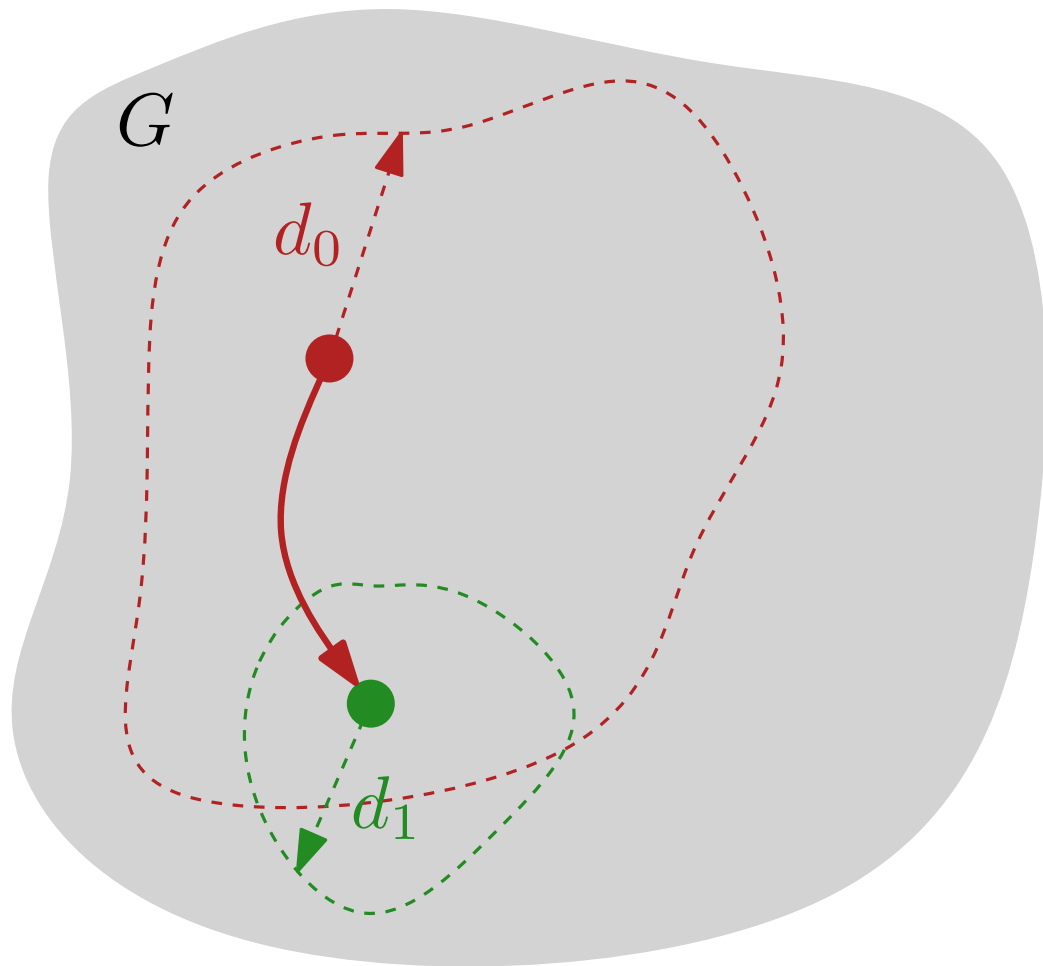


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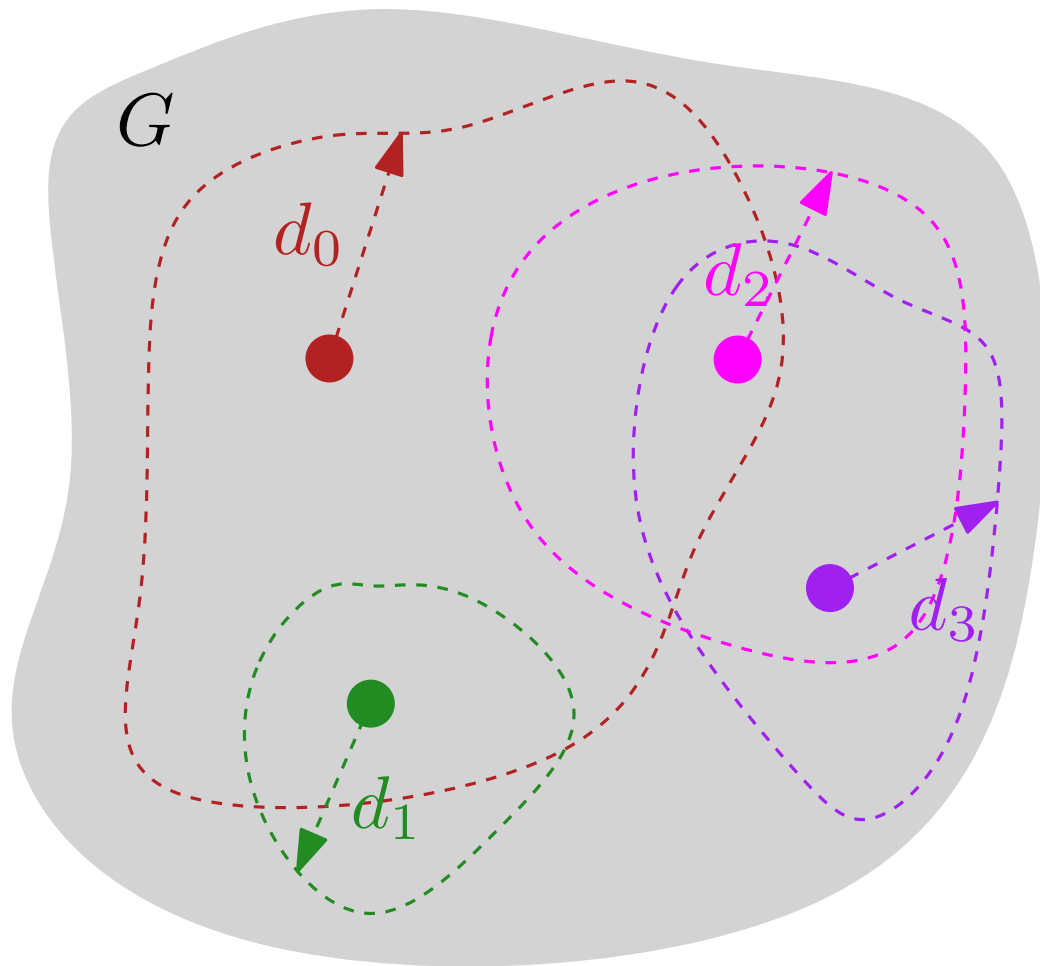
\bullet cannot send infections to \bullet and the survival time of the process is $\approx \exp(d_0) + \exp(d_1) \approx \exp(d_0)$.

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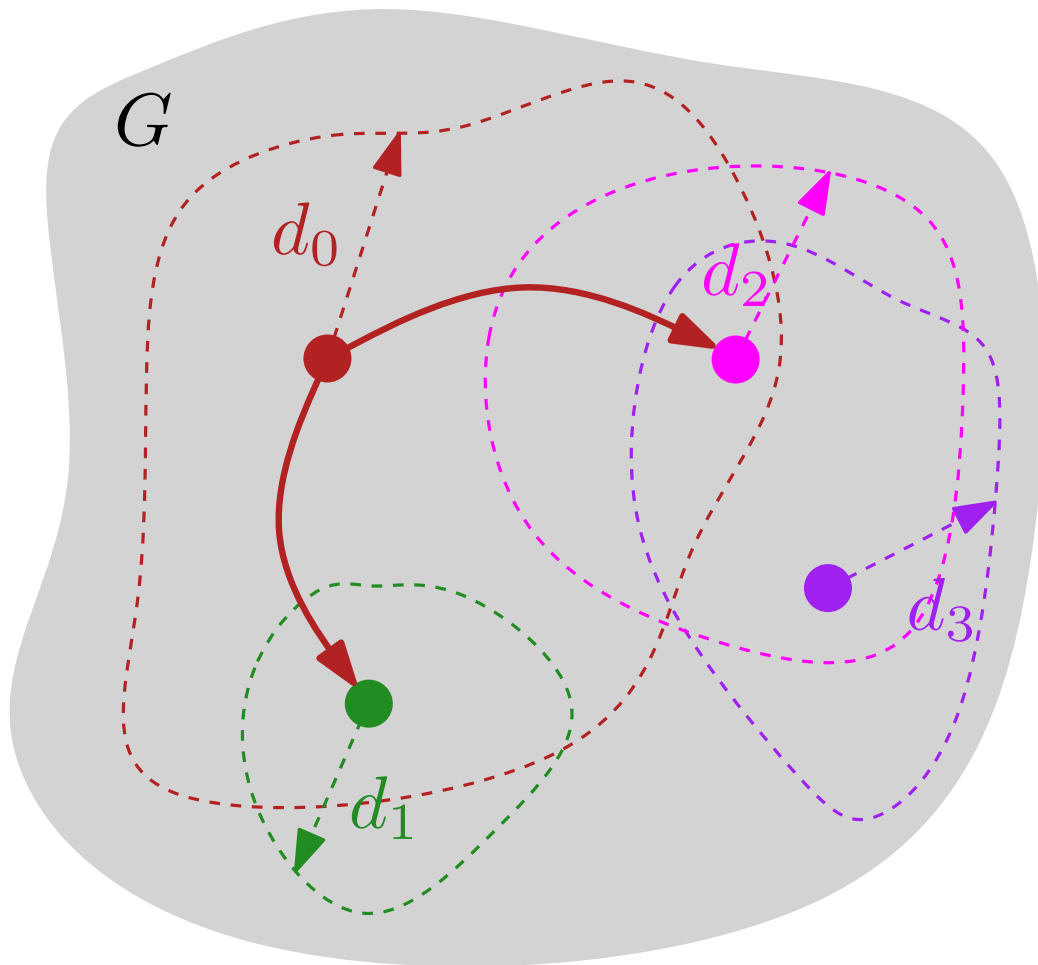


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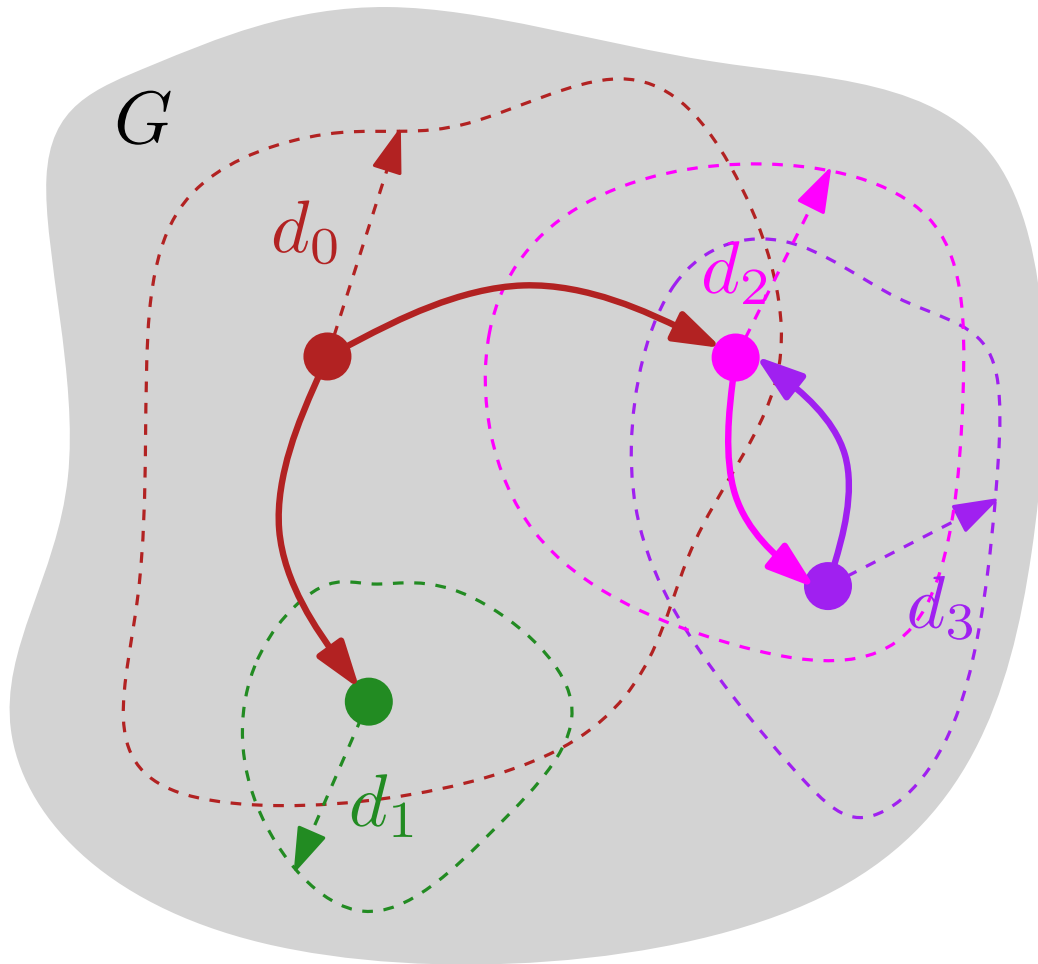
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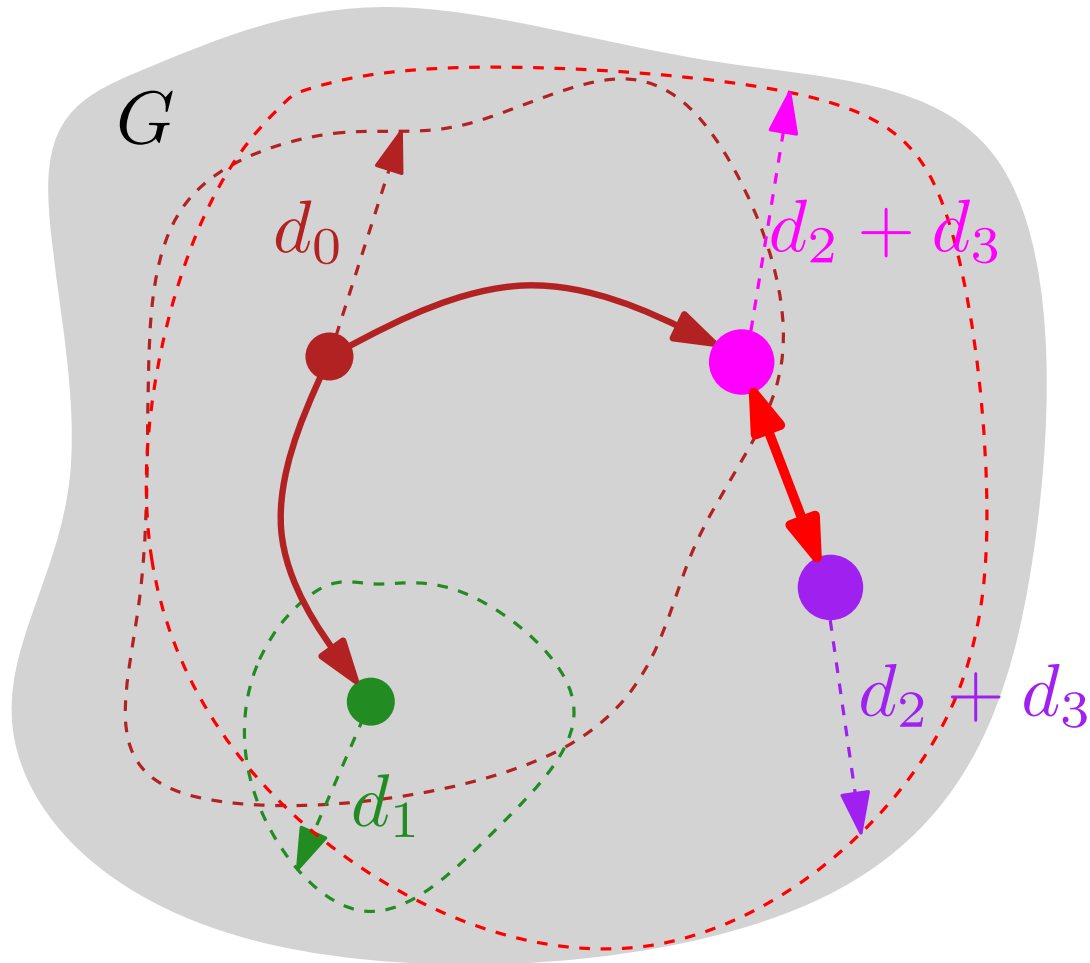


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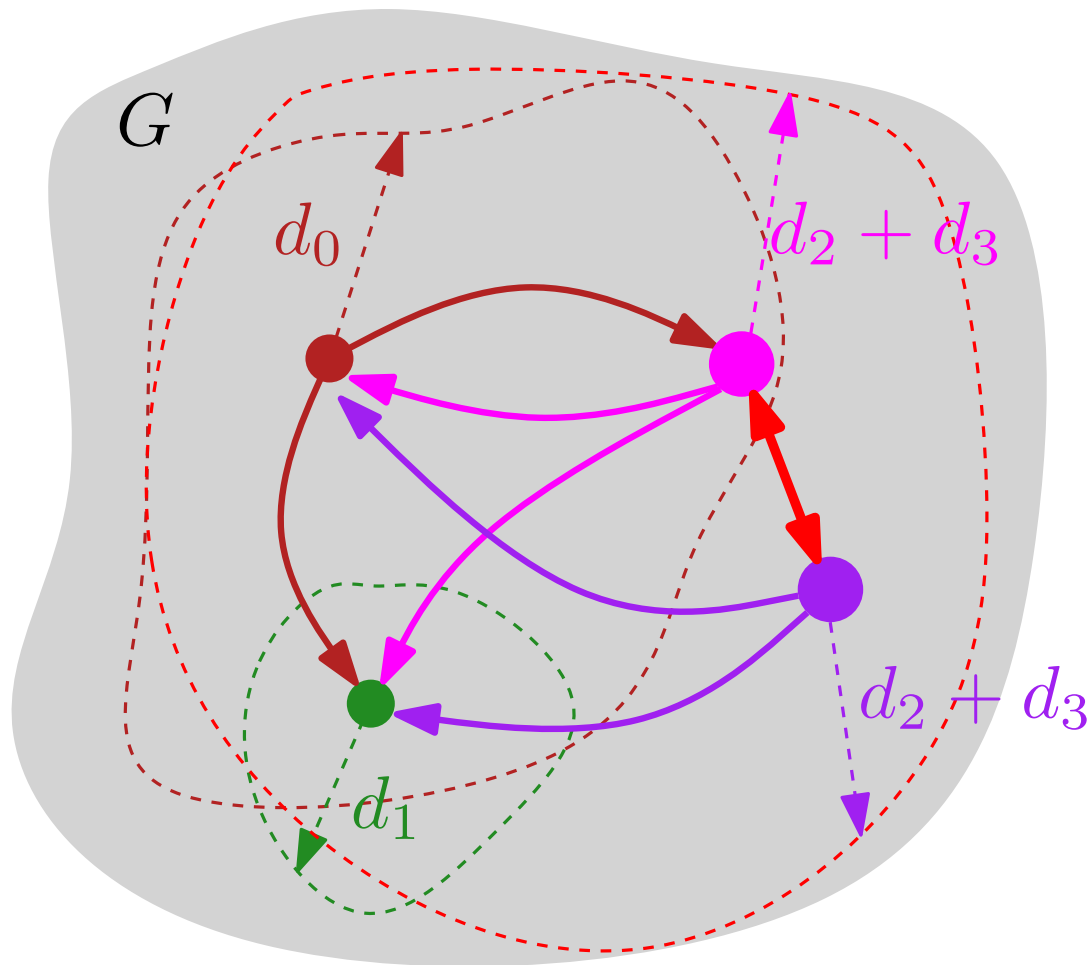
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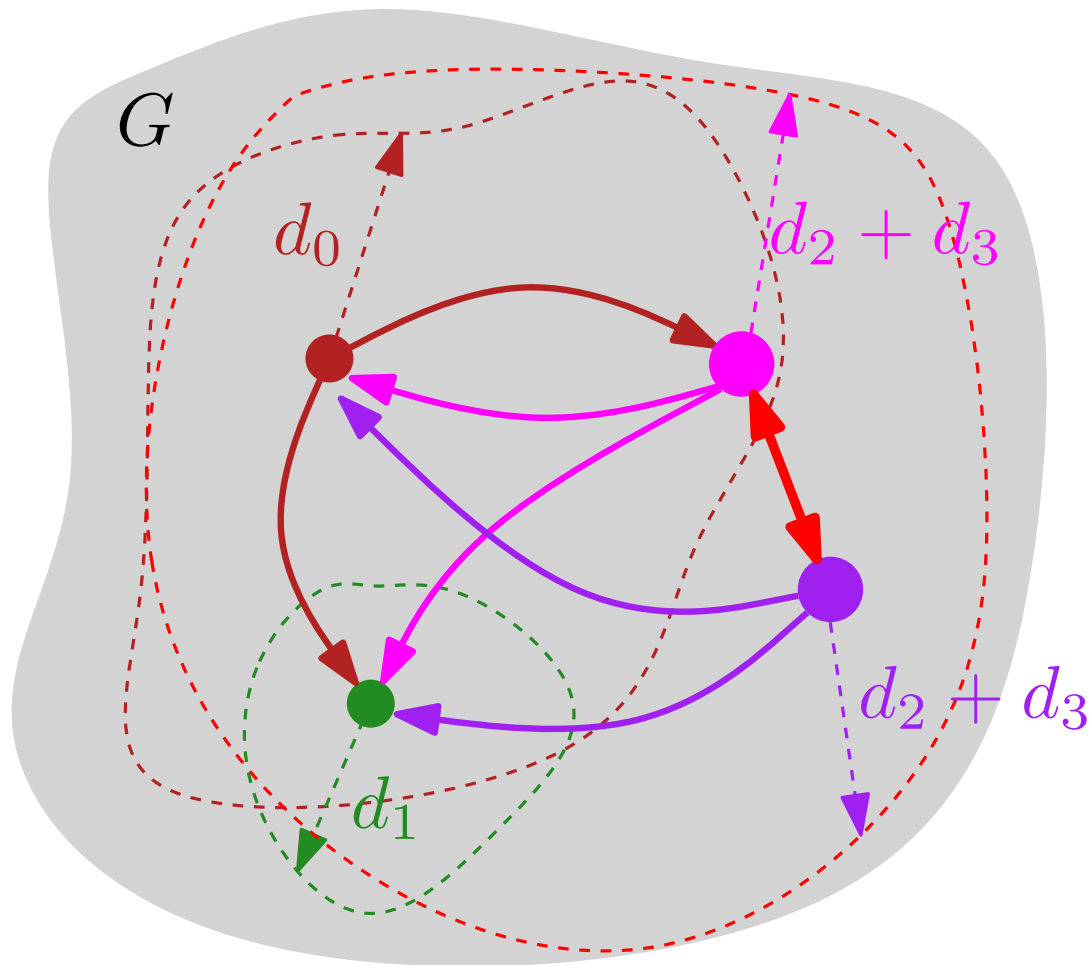
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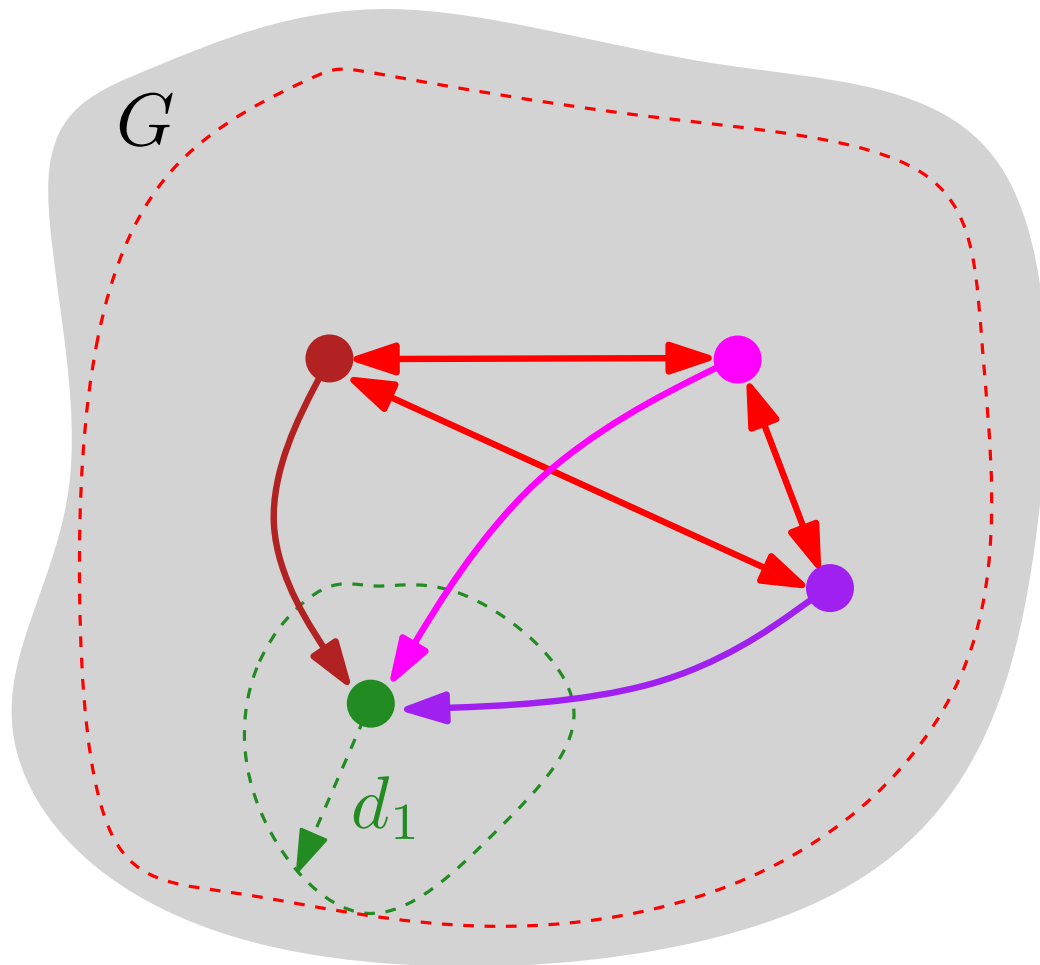
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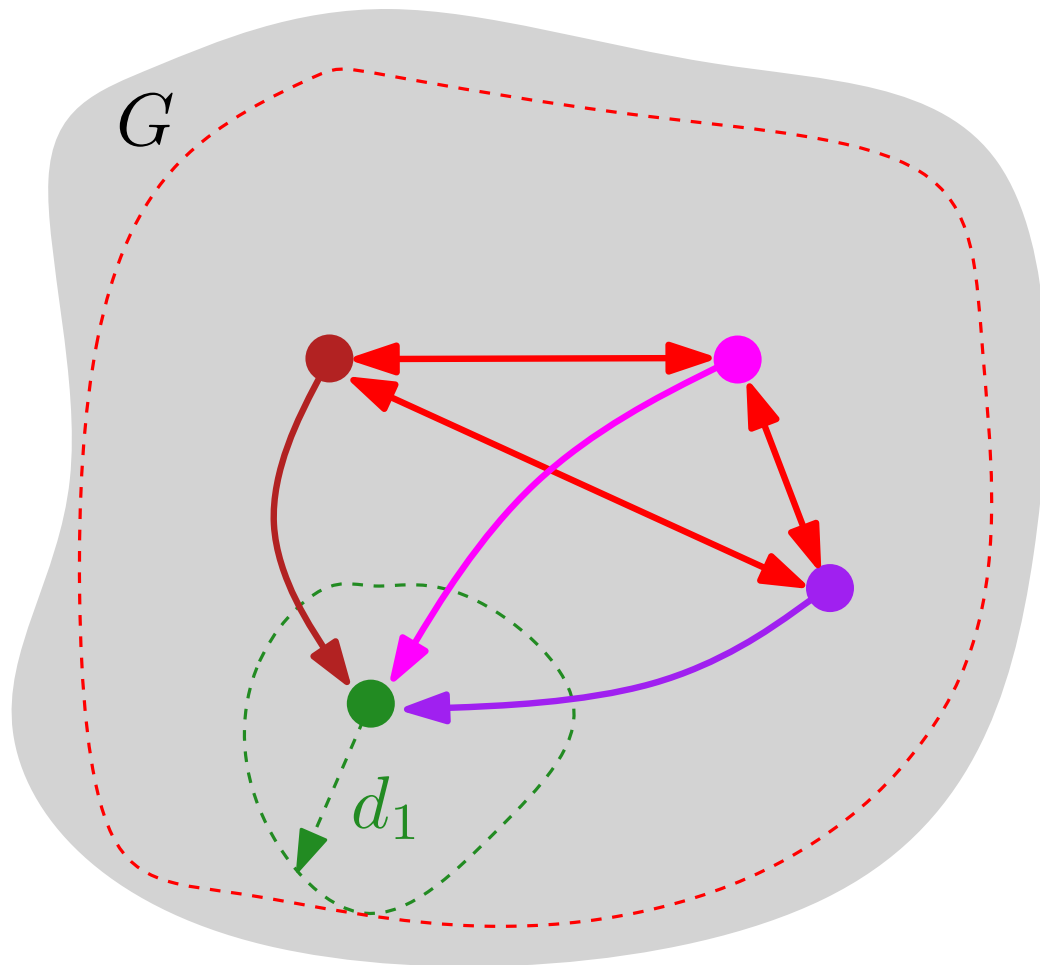
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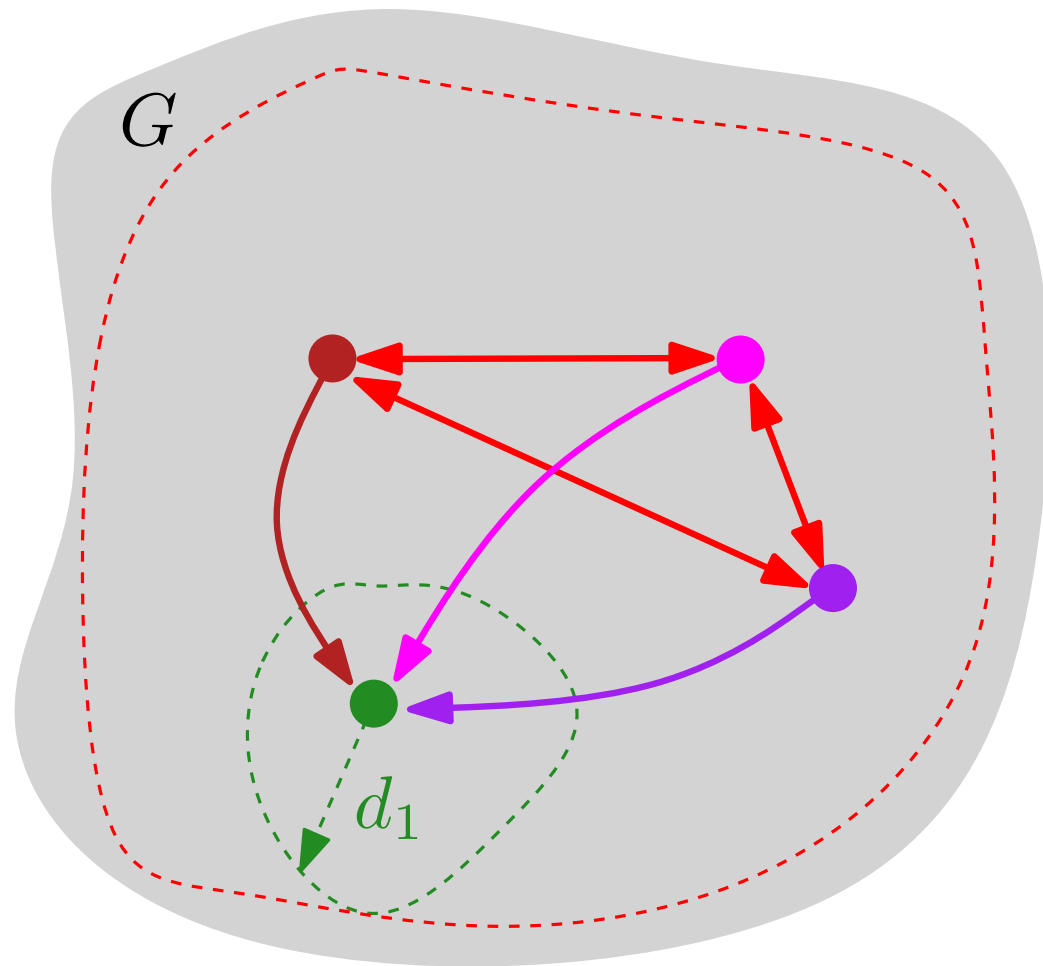


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→ ● still cannot reach the other 3 vertices to interact.

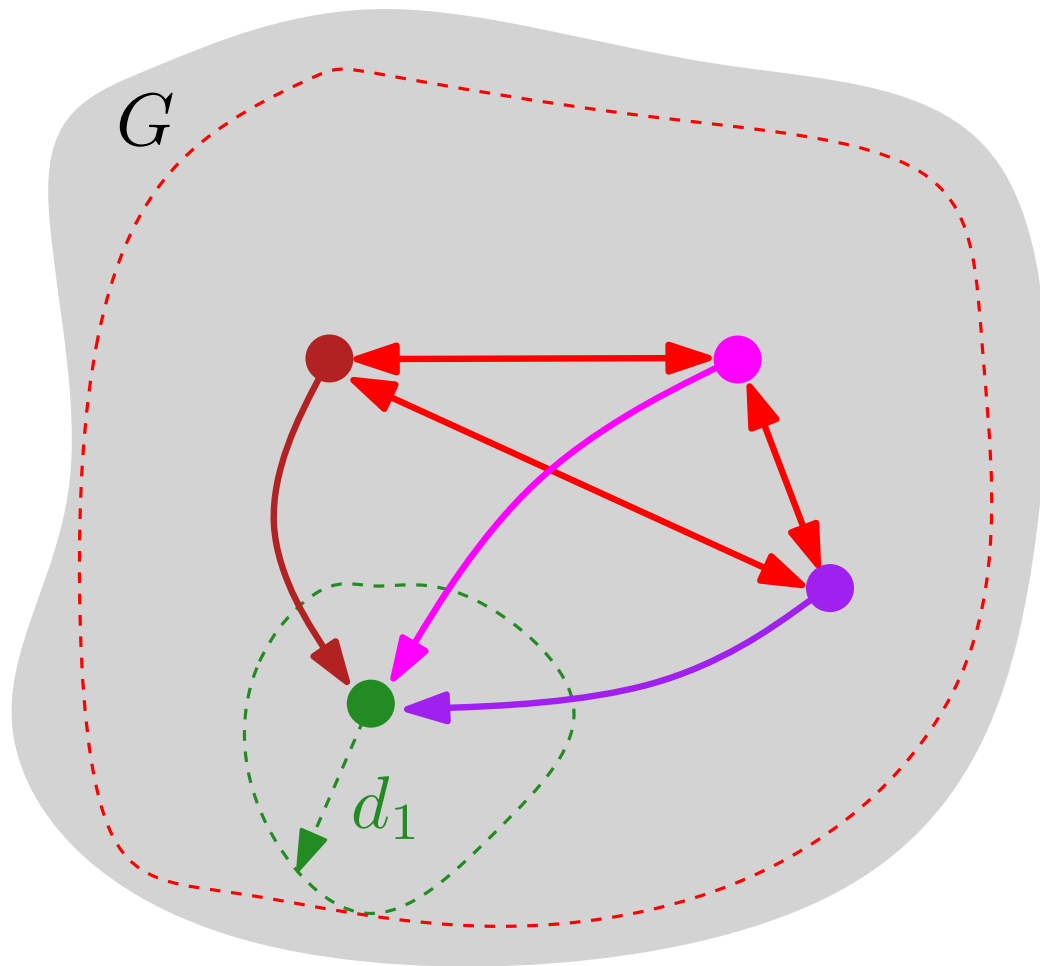
Heuristics for the contact process



Questions:

- Can we recursively group vertices in classes such that for any two different classes A and B we have:
$$d(A, B) > \min \{deg(A); deg(B)\} ?$$
- Is all this hand waving valid?

Heuristics for the contact process



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Cumulative Merging

Cumulative Merging: Admissible partitions

Consider a weighted graph $G = (V, E, r)$ with $r : V \rightarrow [0, \infty]$.

Definition

a partition \mathcal{P} of V is **admissible** iff $\forall A \neq B \in \mathcal{P}$:

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- $\{V\}$ is admissible.
- If \mathcal{P}_1 and \mathcal{P}_2 are admissible, then

$$\mathcal{P}_1 \cap \mathcal{P}_2 := \{C_1 \cap C_2 : C_1 \in \mathcal{P}_1, C_2 \in \mathcal{P}_2\}$$

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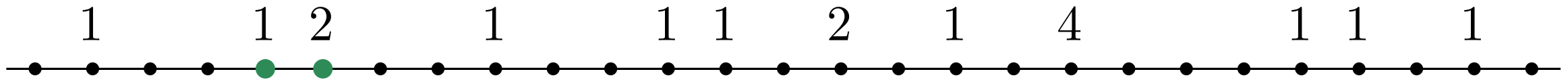
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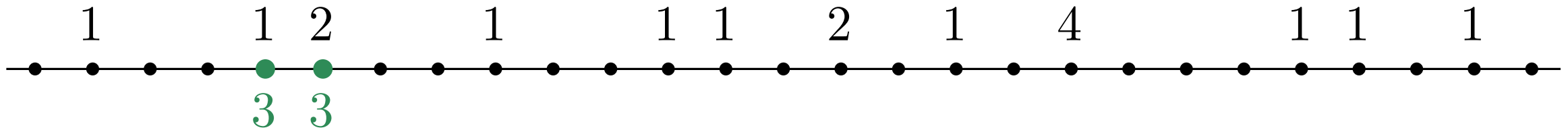
Definition

$$\mathcal{C}(G, r) := \bigcap_{\text{admissible } \mathcal{P}} \mathcal{P} \quad (\text{finest admissible partition})$$

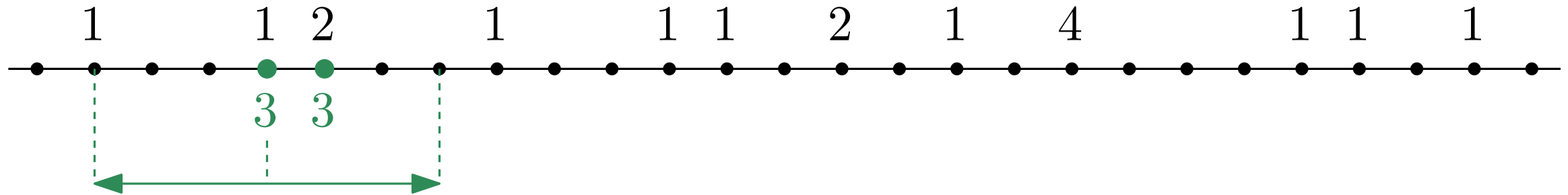
Cumulative Merging: Example and basic properties



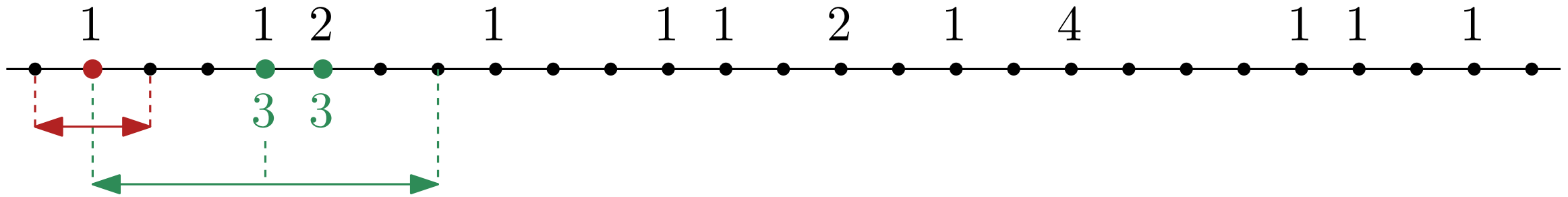
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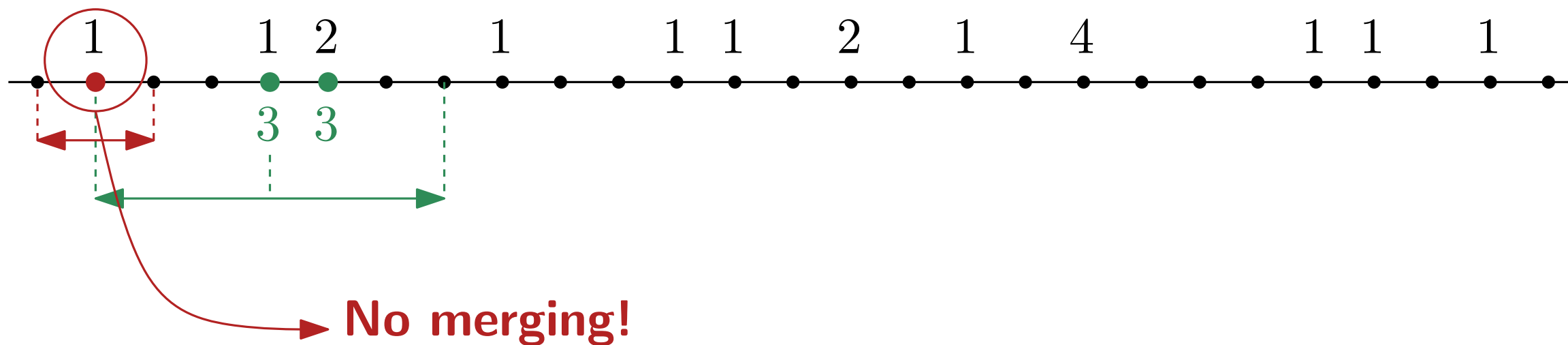
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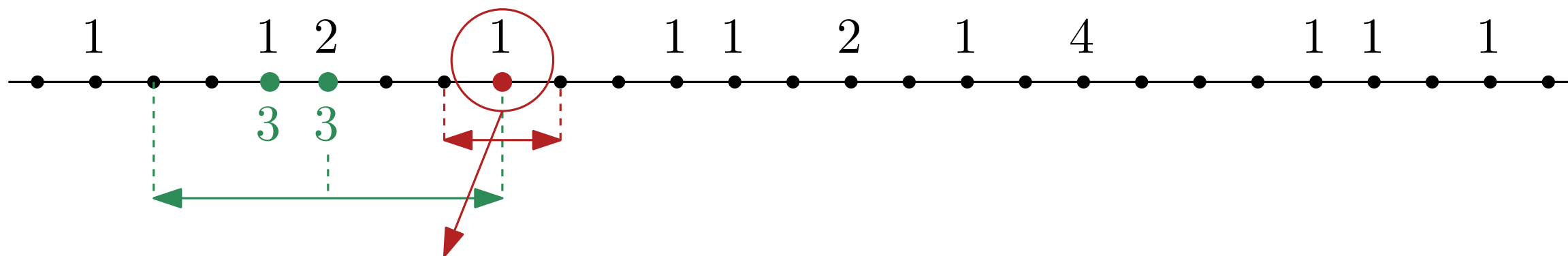
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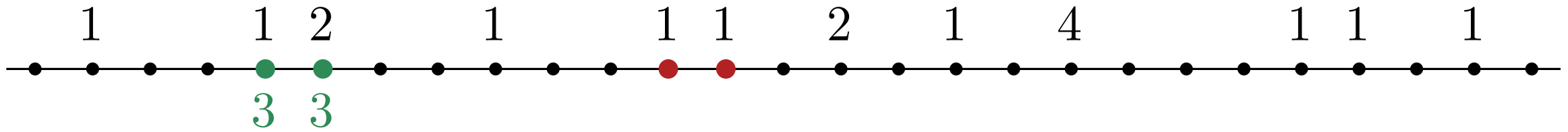


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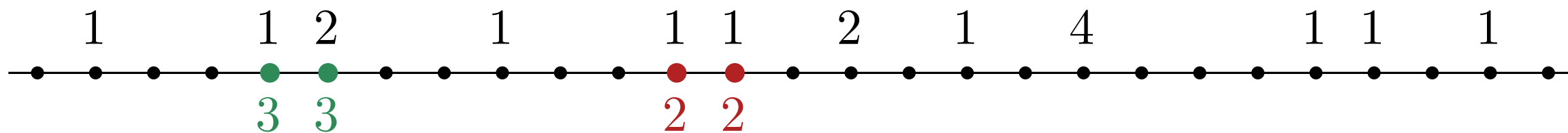


No merging!

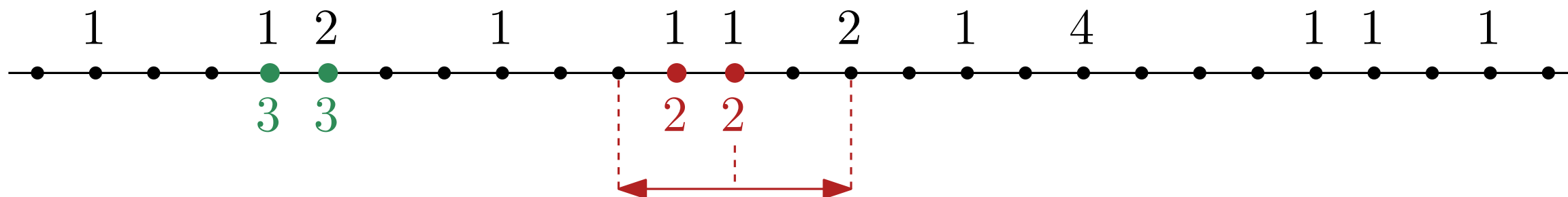
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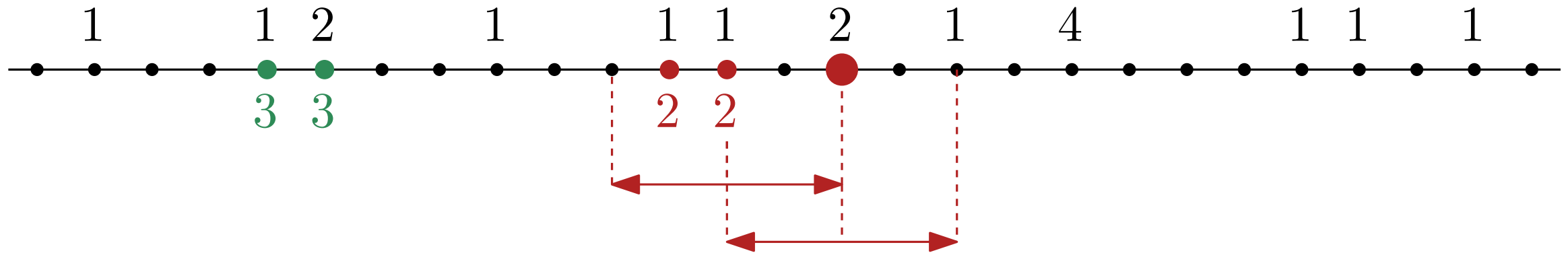
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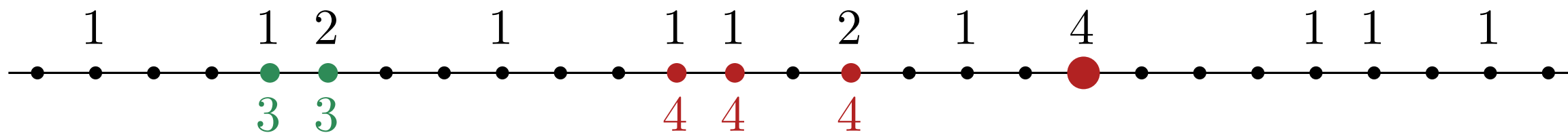
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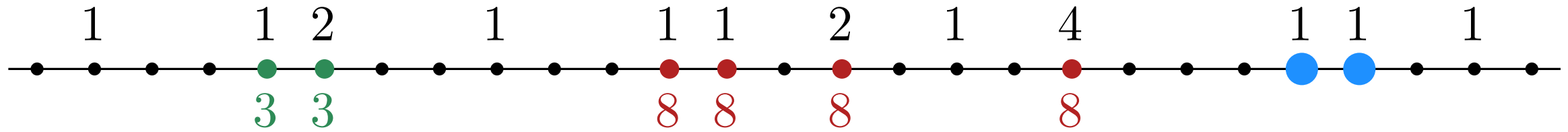
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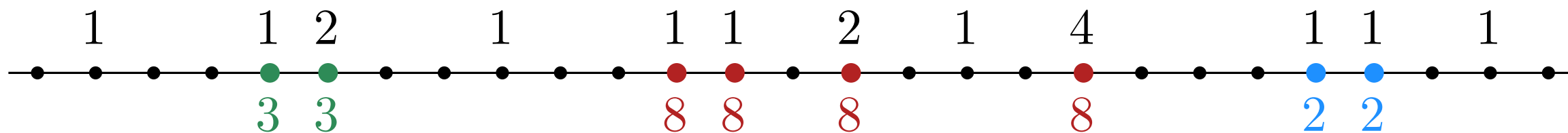
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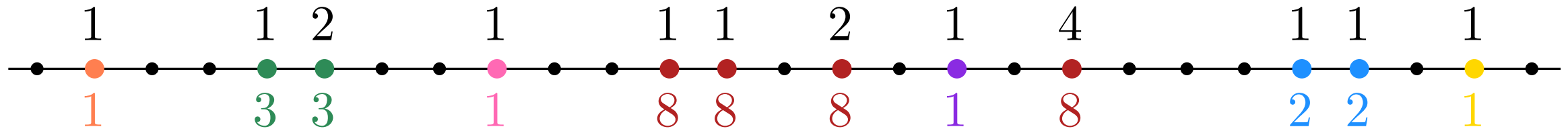
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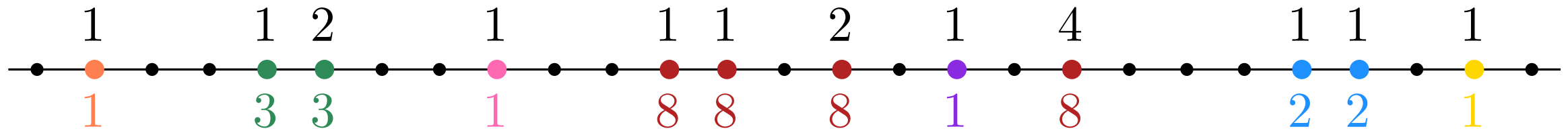
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Proposition

- Clusters in \mathcal{C} are not necessarily connected sets!
- If $r(x) < 1$, then $\{x\} \in \mathcal{C}$.
- If \mathcal{C} has an infinite cluster, it has infinite weight and is unique.
- For any $C \in \mathcal{C}$, one has $|C| \leq \max\{1, r(C)\}$.

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Theorem:

1. CMP on \mathbb{Z}^d : $p_c \in (0, 1)$.
2. CMP on \mathbb{Z}^d : if $E[Z^\beta] < \infty$ for $\beta > (4d)^2$, then $\lambda_c \in (0, \infty)$.
3. CMP on d -dimensional Delaunay triangulation or geometric graph:
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Proofs: Multiscale analysis

Cumulative Merging: Link with the contact process

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Thank you!