### Bellman-Ford. Djikstra. Price Functions.

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Given G=(V,E), w:E\to Z, on edges, and s\in V, find d(s,v) \forall v\in V. d(s,v) - length of shortest path. Djikstra: Non-Negative edge weights: d(v)=\infty, d(s)=0. S=\phi. Find u=\operatorname{argmin}_{v\not\in S}d(v). update(u): for e=(u,v),d(v)=\min(d(v),d(u)+w(e). S=S+u. (Reachable) Negative cycle, answer is undefined. Find price Function: \phi:V\to Z. c_{\phi}(e=(u,v))=\phi(u)-\phi(v)+w(e). Note: d(v)\leq d(u)+w(e)\Longrightarrow d(u)+w(e)-d(v)\geq 0. \phi(v)=d(v) produces non-negative edge weights. Shortest path under c_{\phi}(e) is same as under w(e). p from s to t, \sum_{e\in r}c_{\phi}(e)=\phi(t)-\phi(s)+w(p).
```

Thus: d(s, v) is a price fucntion whose reduced costs make all edge weights positive.

### Decomposition.

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Working with G_{>-1}.
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 $\kappa(G)$  – maximum number of negative edges in any shortest path from s

Note: path is either "trivial" (single edge from s) or negative.

Decomposition Claim: Fast algorithm that finds S, s.t.,

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(1) Progress: W.h.p. s.c.c, \bar{C}, in G/S either (i) either |C| \leq \frac{3}{4}|V| (ii) or \kappa(C) \leq \kappa/2. (2) shortest path P, |P \cap S| = O(\log n).
```

#### Algorithm

- (1) recursively build price functions.
- (2) do O(log n) iterations of Bellman/Dijkstra. All edges in clusters have positive weight. All paths cross clusters O(log n) times.

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O((m+n\log n)\log^2 n) time.
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#### Bellman/Dijkstra.

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Approach: Add s, with w(s,v)=0 for all v\in V.

Bellman/Djikstra Round: Have d(v).

For all e=(u,v), w(e)\leq 0, d(v)=\min(d(v),d(u)+w(e)).

S=\phi.

Find u=\operatorname{argmin}_{v\not\in S}d(v).

update(u): for e=(u,v), d(v)=\min(d(v),d(u)+w(e).

S=S+u.

Claim: After k rounds, d(v)\leq path length with \leq k negative edges. Induction.

O(n) iterations of Bellman/Dijkstra is good.

O(n(n+m\log n)) or slightly better.

Quadratic time.

Scaling algorithm: O(m\sqrt{n}\log nC) by Goldberg.
```

# Low Diameter Strongly Connected Components.

```
G_{\geq 0} All negative weights set to 0. Diameter of strongly connected component, C: D(C) = \max_{u,v \in C} d(u,v). Claim: Any negative path uses at most D(C) negative edges in G_{\geq -1} in C. Proof: \kappa - number of neg. edges in path. Neg. edgeG_{\geq -1} is one more negative in G. path < -\kappa where \kappa is negative edges. but path between endpoints of length \leq D(C). negative cycle in G.
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Scaling Idea: Restricted Shortest Path Instance.
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\begin{split} &O(\log C) \text{ Reduction to the following problem.} \\ &\text{Edge weights} \geq -2, \text{ minimum cycle mean} \geq 1, \text{ add } s \text{ with } w(s,v) = 0. \\ &\text{Todo: price function that ensures all edge weights} \geq -1. \\ &\text{Price function in } G_{\geq -1} \ (w(e) < 0 \rightarrow w'(e) = w(e) - 1) \end{split} &\text{Price function, } phi, \text{ in } G_{\geq -1}. \\ &w'_{\phi}(e = (u,v)) = w'(e) - \phi(v) + \phi(u) \geq 0. \\ &\Longrightarrow w_{\phi}(e) = w(e) - \phi(v) + \phi(u) \geq -1. \end{split} &\text{Some sort of "Scaling".} \\ &\text{Max negative weight } W \rightarrow W/2 \rightarrow W/4.... \\ &O(\log W). \\ &\text{Some complications due to path length } n. \\ &\text{E.g. Maximum negative length path is } nW. \end{split}
```

### Low Diameter Decomposition.

Out-Region growing....symmetric.

```
Categorization: \begin{aligned} &\text{In-Balls}(\Delta, v) \colon \{u : d(u, v) \leq \Delta\}. \\ &\text{Out-Balls}(\Delta, v) \colon \{u : d(u, v) \leq \Delta\}. \\ &\text{In-Light-Vertices: Size of In-Balls} \leq \frac{3}{4}|V|. \\ &\text{In-Heavy: otherwise.} \\ &\text{Out-Light and Out-Heavy similar.} \\ &\text{In-Region-growing around } v \colon \\ &\text{Random geometric } \ell \in G(p), \, p = 20\log n/\Delta. \\ &\text{Region: } \{u : d(u, v) \leq \ell\} \\ &\text{(1) Region-grow from light vertex.} \\ &\text{(2) Remove region from light-vertices.} \end{aligned}
```

## Decomposition: analysis.

```
Graph is SCC of with kappa = \kappa(G)
In-Region-growing around v:
  Random geometric \ell \in G(p), p = 20 \log n/\kappa.
  Region: \{u: d(u,v) \leq \ell\}
(1) Region-grow from light vertex for \Delta = \kappa/4.
(2) Remove region from light-vertices.
(3) Repeat.
Claim: edge is between regions with probability
pw(e) = 20w(e) \log n/\kappa
Proof: Pr[edge(x, y) \text{ in different region.}]
  \sum_r Pr[y \text{ not in } r|x \text{ in } r]Pr[x \text{ in } r].
  Note: \sum_{r} Pr[x \text{ in } r] \leq 1.
    Even in Texas probabilities ≤ 1.
  Pr[y \notin r | x \in r] \leq Pr[\ell \in [d(v(r), x), d(v(r), y)]] \leq pw(e)
Implies that O(\log n) expected edges in weight \leq \kappa positive weight
path.
```

### Decomposition: analysis.

```
Graph is SCC with \kappa = \kappa(G)
```

In-Region-growing around *v*:

Random geometric  $\ell \in G(p)$ ,  $p = 20 \log n/\kappa$ .

Region:  $\{u: d(u,v) \leq \ell\}$ 

- (1) Region-grow from light vertex.
- (2) Remove region from light-vertices.
- (3) Repeat.

Claim: Removing between edge regions w.h.p. leave

- (i) SCC of size  $\leq \frac{3}{4}|V|$ .
- (ii) or SCC's C of  $\kappa(C) \leq \kappa/2$ .
- (i) Regions from light vertices, thus are small, w.h.p.
- (ii) Remaining vertices have heavy in-balls and out-balls.

In cycle of diameter  $\leq \kappa/2$ 

 $\Longrightarrow \le \kappa/2$  edges in neg path.

#### Quick Review.

Price functions: Find  $\phi$  takes -W edges to -W/2 edges. Repeat.  $O(\log nW)$  Subtlety is path length.

Small diameter SCC's with many hop negative path in  $G_{\geq -1}$   $\implies$  have negative cycle in  $G_{\geq -2}$ .

Decompose graph by removing edges into smaller SCC's or smaller diameter SCC's.

And:

Expected edges between components on short path  $O(\log n)$ .

#### Alg:

- (1) Local price functions with recursion.
- (2) Dijkstra/Bellman with expected  $O(\log n)$  iterations. Slightly subtle, expected requeing is  $O(\log n)$  per vertex.