Fixed-Parameter Tractability of Maximum Colored Path and Beyond

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joint work with Fedor V. Fomin, Petr A. Golovach, Kirill Simonov¹, and Giannos Stamoulis²

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Helsinki CS Theory Seminar

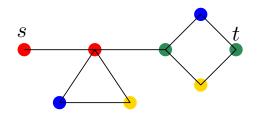
10 August 2022

Task:

MAXIMUM COLORED *s*, *t*-PATH

Input: Vertex-colored undirected graph, vertices *s* and *t*, and an integer *k*.

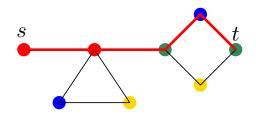
Find an s, t-path containing at least k different colors.



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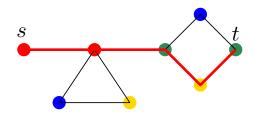


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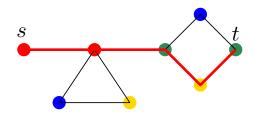


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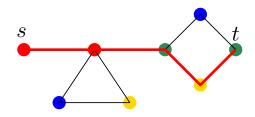
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- A path does not contain repeated vertices
- A color may repeat multiple times in the path, and it can contain more than k colors

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Theorem

There is a $2^k n^{O(1)}$ time randomized algorithm for maximum colored *s*, *t*-path. Moreover, the algorithm returns the shortest solution.

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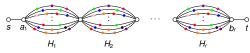
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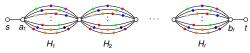
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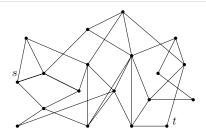
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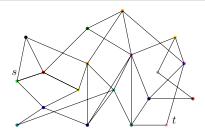
• NP-hard for directed graphs already when k = 2

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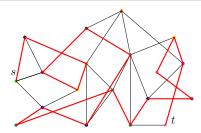
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• Longest *s*, *t*-path reduces to maximum colored *s*, *t*-path by coloring all vertices with different colors

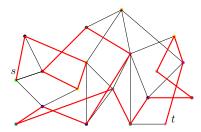
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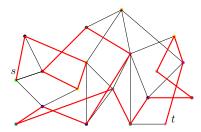
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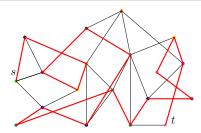
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 - Previous best algorithm 4.884^k $n^{O(1)}$ time [Fomin, Lokshtanov, Panolan, Saurabh, Zehavi'18]

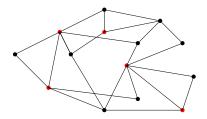
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 - Previous best algorithm 4.884^k n^{O(1)} time [Fomin, Lokshtanov, Panolan, Saurabh, Zehavi'18]
 - In contrast, there is a 1.66^k n^{O(1)} time algorithm for longest path [Björklund, Husfeldt, Kaski, Koivisto'17]

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Input: Undirected graph and a set of terminal vertices *T*.



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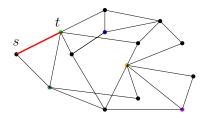
Task: Find a cycle that visits each vertex in *T*.



• $2^{|T|} n^{O(1)}$ time algorithm for *T*-cycle [Björklund, Husfeldt, Taslaman'12]

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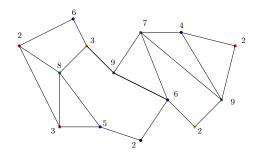
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 - Allows for generalizations, e.g., arbitrarily large T

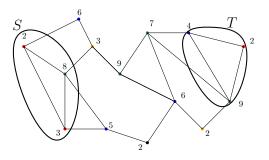
Input:

• Colored positive-integer weighted undirected graph



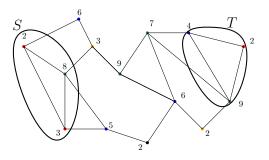
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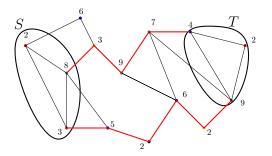


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• Find *p* vertex-disjoint paths starting in *S* and ending in *T* so that



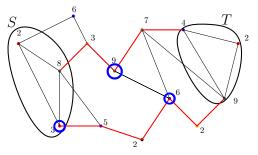
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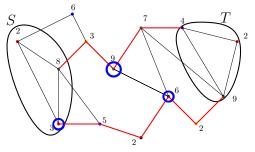
Here, p = 2, k = 3, and w = 18.

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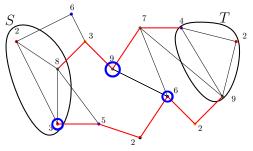
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Main theorem: Randomized algorithm with time complexity $2^{k+p}n^{\mathcal{O}(1)}w$.

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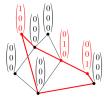


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- Generalization from colored graphs to (graph, matroid) pairs represented over a finite field of order q with a $2^{\mathcal{O}(k^2 \log(q+p))}$ factor overhead





The algorithm

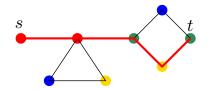
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Outline

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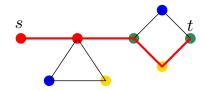


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• Algorithm based on algebraic approach, extending ideas that were developed by [Björklund, Husfeldt, Taslaman'12], [Björklund'14], [Björklund, Husfeldt, Kaski, Koivisto'17] for *T*-cycle, hamiltonicity, and *k*-path

General idea:

• Design a multivariate polynomial $p(x_1, ..., x_m)$ of total degree $\leq 4n$ over $GF(2^{3+\lceil \log n \rceil})$ (finite field of order $\geq 8n$ and characteristic 2) so that

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- Characteristic 2?
 - x + x = 0 for any x

Design of the polynomial

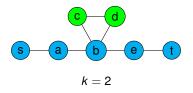
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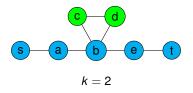
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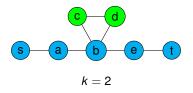
- Evaluating a polynomial over walks is easier than over paths
- Argue that monomials corresponding to non-path walks and paths with less than k colors cancel out (by x + x = 0), and only the contribution of k-colored paths remains



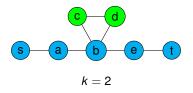
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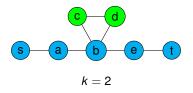
(s, t)-walk of length ℓ is a sequence s = v₁ ... v_ℓ = t of ℓ adjacent vertices
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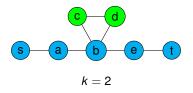
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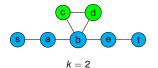
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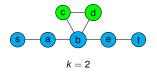


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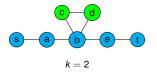
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- A labeled (s, t)-walk is labeled-digon-free if it has no subwalks of form aba





Definition:

- For each edge uv associate variable $f_e(uv)$
- For each vertex w associate variable $f_v(w)$
- For each color-label pair (x, y) associate variable $f_c(x, y)$

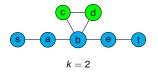


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For a labeled walk W, associate monomial f(W) that is product of edge variables, vertex variables of labeled vertices, and color-label pair variables corresponding to labeled vertices

 $f(\overset{1}{sabcdbet}) = f_e(sa)f_e(ab)f_e(bc)f_e(cd)f_e(db)f_e(be)f_e(et)f_v(b)f_v(d)f_c(\bullet,1)f_c(\bullet,2)$



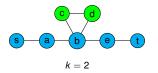
Definition:

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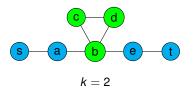
Now we claim that:

- 1. Exists a *k*-colored (s, t)-path of length $\ell \Rightarrow f(C_{\ell})$ non-zero
- 2. No *k*-colored (*s*, *t*)-path of length $\leq \ell \Rightarrow f(C_{\ell})$ identically zero

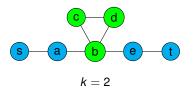
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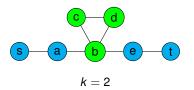


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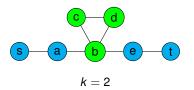
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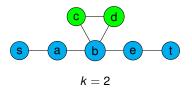
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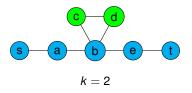
 \Rightarrow Labeled walks in C_{ℓ} can be paired as $\{W, \phi(W)\}$, implying everything cancels out over fields of characteristic 2

Three different cancellation arguments as building blocks for ϕ :

- Bijective-labeling based cancellation (from [Björklund'14], [Björklund, Husfeldt, Kaski, Koivisto'17])
- Cycle-reversal based cancellation (from [Björklund, Husfeldt, Taslaman'12])
- Label-swap based cancellation

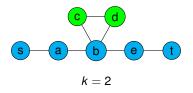


Consider labeled walks where two vertices of the same color are labeled



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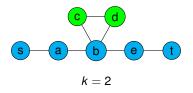
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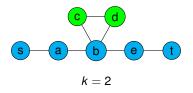
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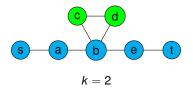
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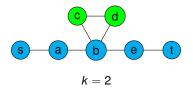


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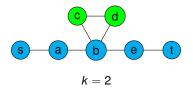
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- $\phi(\overset{1}{sabet}) = \overset{2}{sabet} \overset{1}{t}$ and $\phi(\overset{2}{sabet}) = \overset{1}{sabet}$
- Now we can work with family $C_\ell^* \subseteq C_\ell$ containing labeled walks where all labeled vertices have different colors



• Labeled walk $sabcdbet \in C_7^*$ contributes monomial $f_e(sa)f_e(ab)f_e(bc)f_e(cd)f_e(db)f_e(be)f_e(et)f_v(a)f_v(c)f_c(\bullet, 1)f_c(\bullet, 2)$

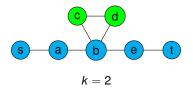


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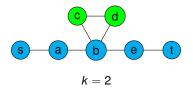
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- Reverse the cycle b^2_{cdb}
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- $\phi(sabc2dbet) = sabc2bet$ and $\phi(sabc2bet) = sabc2dbet$
- This does not cleanly handle things, need more arguments and case analysis

• Consider a labeled walk *sabcdabt* (with only one label)

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Cancellation arguments

 Bad news: Not clear when to apply cycle reversal and when label swap

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Definition 3 (The function ϕ). Let $W = (W^1, ..., W^p)$ be a proper barren haledot walkage of order s. For each $i \in [p]$, denote $W^i = ((v_1^i, ..., v_{\ell_i}^j), (r_1^i, ..., r_{\ell_i}^j))$. The value $\phi(W)$ is defined, in some cases recursively, by selecting the first matching case (rom the following list:

A. if the vertex v¹₁ occurs only once in W:

1. if $\ell_1 \ge 2$, then $\phi(W) = W^1[1, 1] \circ \phi(W^1[2, \ell_1], W^2, ..., W^p)$. 2. otherwise (i.e., $\ell_1 = 1$), $\phi(W) = W^1 \sqcup \phi(W^2, ..., W^p)$.

- B. if the vertex v_1^1 occurs in all basis three different walks W^* : There must be at least two different walks W^* that contain v_2^1 but do not contain it as labeled. Let i, j be the was smallest induces so that look W^* and W^* contain v_1^1 but do not contain it as labeled. Let a be the index of the first occurrence of v_2^1 in W^* and b be the index of the first occurrence of v_1^1 in W^* . Now, $A(W) = W + v_2^*$.
- C. if the vertex v¹₂ occurs only in the walk W¹: By the case (A), the vertex v¹₂ occurs multiple times in W¹. Let b be the index of the last

occurrence of v_1^1 in W^1 and a be the index of the second last occurrence of v_1^1 in W^1 . Note that a = 1 if v_1^1 occurs only twice in W^1 , and note also that $1 \le a \le b - 2$.

1. if $r_1^1 = r_b^1 = 0$:

(a) if W¹[2, b − 1] is not a paindrome, then φ(W) = (W¹[2, b − 1], W²,..., W^p).
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 Note: If neither case (1) nor (2) applies, then r¹₁ ≠ 0.
- if W¹[2, a 1] is not a palindrome, then φ(W) = (W¹[2, a 1], W²,..., W^p). Note: If a = 1, then W¹[2, a - 1] is the empty walk which is a palindrome.
- 4. if $v_{a+1}^1 = v_{b-1}^1$:

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 (b) otherwise, φ(W) = W¹[1,b] ◦ φ(W¹[b+1, t₁], W²,..., W^p).
 Note: Here W¹[b+1, t₁] cannot be an empty walk because by case (C.2) b is a digon in W¹.

X. otherwise, $\phi(W) = W^1[1, a] \diamond \phi(W^1[a + 1, \ell_1], W^2, ..., W^p)$. Note: The case C.X will form a "common case" with the case D.X.

- D. if the vertex v_1^1 occurs in exactly two different walks: Let i be the index of the another walk W^1 in which v_1^1 occurs and let b be the index of the first occurrence of v_1^1 in W^1 .
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- 6. if v¹_{n+1} = v¹_{b+1}, then φ(W) = W ↔¹_{n+1,b+1}. Note: By case (5) it holds that a < t₁ and by case (2) it holds that b < t_i.
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- Bad news: Not clear when to apply cycle reversal and when label swap
- Good news: We managed to construct φ, but it is very complicated
 - Single-path version has 8 cases, multi-path version 18 cases

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(3) $f(\mathcal{C}_{\ell})$ can be evaluated in time $2^k n^{\mathcal{O}(1)}$

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Evaluating $f(\mathcal{C}_{\ell})$

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Evaluating $f(\mathcal{C}_{\ell})$

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- ⇒ By DeMillo–Lipton–Schwartz–Zippel lemma, $2^k n^{O(1)}$ time algorithm for *k*-colored (*s*, *t*)-path that works with high probability

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- Extending from colors to combination of weights and colors is easy
 - Instead of weights, could ask for any property that can be efficiently evaluated in DP

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- Open problem: Is there a $1.99^k n^{\mathcal{O}(1)}$ time algorithm for longest (s, t)-path?

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