

The Traveling Tournament Problem: Complexity Aspects

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(based on joint work with
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Salomon Bendayan (2022). The Traveling Tournament Problem. UWSpace.

<http://hdl.handle.net/10012/18553>

Traveling Tournament Problem

(Easton, Nemhauser, Trick 2001)

Given n teams (n is even) and inter-team metric distances (i.e., $n \times n$ matrix D of inter-team distances satisfying the triangle inequality) find a tournament (i.e., a double round-robin schedule) such that

- ▶ each pair of teams i, j plays two games, one at home-venue of i and one at home-venue of j ,
- ▶ the total distance travelled is minimized (assume “round-trip travel” for each team, that starts & ends at home-venue).

Notes:

Number of rounds = number of *days* = $2(n - 1)$

OBJ: $\min \sum_{\text{TEAM } i} (\text{distance traveled by } i \text{ over } 2(n - 1) \text{ days})$

TTP: Example with $n = 6$ teams

<u>Team</u> →	1	2	3	4	5	6
Day ↓						
1	@5	@4	@6	2	1	3
2	6	5	4	@3	@2	@1
3	2	@1	@5	@6	3	4
4	@3	@6	1	5	@4	2
5	4	3	@2	@1	6	@5
6	5	4	6	@2	@1	@3
7	@6	@5	@4	3	2	1
8	@2	1	5	6	@3	@4
9	3	6	@1	@5	4	@2
10	@4	@3	2	1	@6	5

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4	@3	@6	1	5	@4	2
5	4	3	@2	@1	6	@5
6	5	4	6	@2	@1	@3
7	@6	@5	@4	3	2	1
8	@2	1	5	6	@3	@4
9	3	6	@1	@5	4	@2
10	@4	@3	2	1	@6	5

Trips by Team 1:



Trips by Team 6:



TTP: Questions

- ▶ Is there a poly-time algorithm for optimally solving TTP?
- ▶ Is there a PTAS (i.e., poly-time approximation scheme) for solving TTP?

TTP: Results

- ▶ (Bhattacharyya'09, ORL'16)
(unrestricted) TTP is NP-hard.
($\implies \nexists$ poly-time algorithm, assuming $\mathbf{P} \neq \mathbf{NP}$)

- ▶ (BCC) (unrestricted) TTP is APX-hard.
($\implies \nexists$ PTAS, assuming $\mathbf{P} \neq \mathbf{NP}$)

TTP: Results & Open Question

- ▶ (Bhattacharyya'09, ORL'16)
(unrestricted) TTP is NP-hard.
($\implies \nexists$ poly-time algorithm, assuming $\mathbf{P} \neq \mathbf{NP}$)
 - ▶ (BCC) (unrestricted) TTP is APX-hard.
($\implies \nexists$ PTAS, assuming $\mathbf{P} \neq \mathbf{NP}$)
-

- ▶ (Thielen, Westphal TCS'11) 3-restricted TTP is NP-hard.
- ▶ (**Open**) 3-restricted TTP is APX-hard?

Bhattacharyya/BCC construction: $uTTP$ is NP-hard

- ▶ Let $c > 5$ be a constant.
- ▶ G is a complete graph on n vertices, with edge costs in $\{1, 2\}$, v is a designated vertex of G .
- ▶ $G^{(c)}$ is the “one sum” of c copies of G with common vertex v , it has $c(n-1) + 1$ vertices.
- ▶ G' is the metric completion of $G^{(c)}$.

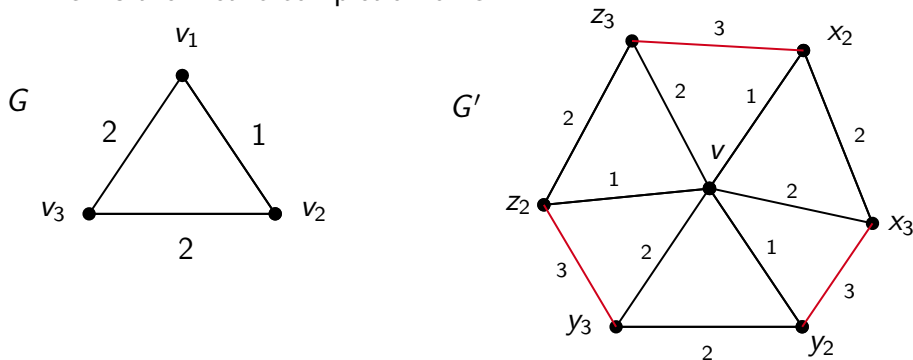


Figure: Small example: G' from G with $c = 3$.

Bhattacharyya/BCC construction: $uTTP$ is NP-hard

- ▶ G is a complete graph on n vertices, with edge costs in $\{1, 2\}$, v is a designated vertex of G .
- ▶ G' is the metric completion of $G^{(c)}$, where $G^{(c)}$ is the “one sum” of c ($c > 5$) copies of G with common vertex v .
- ▶ **Claim:** an optimal TSP tour on G has cost $K \iff$ an optimal TSP tour on G' has cost cK .

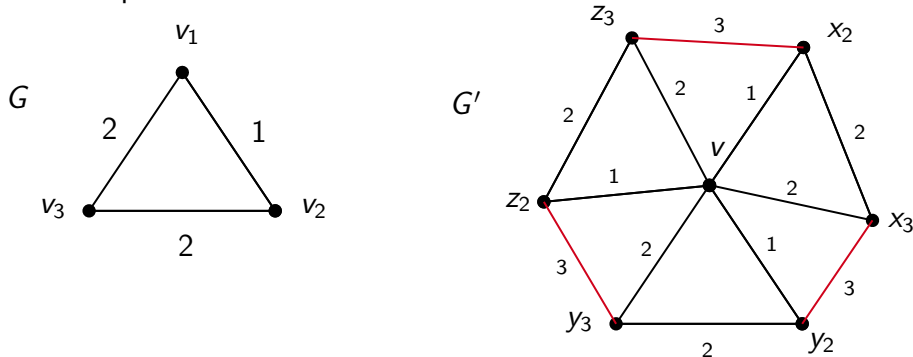


Figure: Small example: G' from G with $c = 3$.

Bhattacharyya/BCC construction: $uTTP$ is NP-hard

- ▶ G is a complete graph on n vertices, with edge costs in $\{1, 2\}$, v is a designated vertex of G .
 $K :=$ cost of optimal TSP tour of G .
- ▶ G' is the metric completion of $G^{(c)}$, where $G^{(c)}$ is the “one sum” of c ($c > 5$) copies of G with common vertex v .
 $cK :=$ cost of optimal TSP tour of G' ,
 $m := |V(G')| = c(n - 1) + 1$.
- ▶ Construct a new graph H by adding vertex u to G' , and connecting u to all vertices of G' with edges of cost $w_u = (cK - 1)/2$.
- ▶ Construct the TTP instance on H by placing 2 teams at v (the central vertex of G'), one team at every other vertex of G' , and $(m + 1)(10m - 1)$ teams at u to get $n' = 10m(m + 1)$ teams in total.

Lemma

H has a feasible TTP solution of cost $\leq 20m(m + 1)cK$.

Bhattacharyya/BCC construction: u TTP is NP-hard

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Lemma

H has a feasible TTP solution of cost $\leq 20m(m+1)cK$.

Proof.

- ▶ Partition the teams into $10m$ groups, each of size $m+1$.
- ▶ Group 1 := the $m+1$ teams placed on G' .
- ▶ DRR schedule consists of batch of **intra-group** games (with $2m$ games) followed by batch of **inter-group** games.
- ▶ **Claim:** Cost of DRR schedule $\leq 8m(m+1) + \left((m+1)2w_u + (10m-1)((m+1)2w_u + mcK) \right)$.

TTP: Example with 4 groups

DRR schedule for $H = u \oplus G'$

(10m-1) teams
 (m+1) teams
 (m+1) teams

Groups
 Days ↓

Intra-group games (DRR) 2m days

	G1	G2	G3	G4
	G1	G2	G3	G4

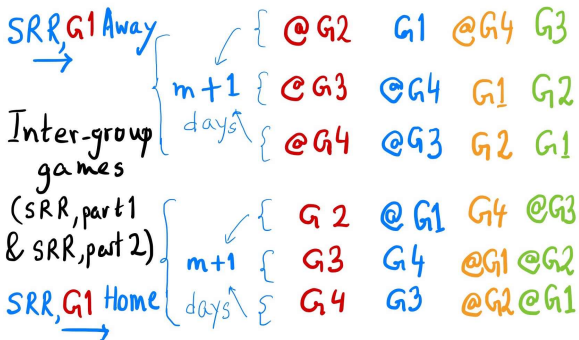
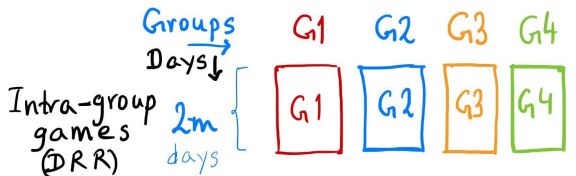
Inter-group games (SRR, part 1 & SRR, part 2) m+1 days

	@G2	G1	@G4	G3
	@G3	@G4	G1	G2
	@G4	@G3	G2	G1
	G2	@G1	G4	@G3
	G3	G4	@G1	@G2
	G4	G3	@G2	@G1

TTP: Example with 4 groups

DRR schedule for $H = u \oplus G'$

(10m-1) \uparrow (m+1) teams
 (m+1) teams



Bhattacharyya/BCC construction: uTTP is NP-hard

Lemma: H has a feasible TTP solution of cost $\leq 20m(m+1)cK$.

Proof of lemma:

- ▶ Partition the teams into $10m$ groups, each of size $m+1$.
- ▶ Group 1 := the $m+1$ teams placed on G' .
- ▶ DRR schedule consists of batch of **intra-group** games (with $2m$ games) followed by batch of **inter-group** games.
 - ▶ **Intra-group** games: All groups, except Group 1, are located at u and incur zero cost. Each team in Group 1 plays m Away-games and incurs cost $\leq (2c_{max})m = 8m$ ($c_{max} = \max_{e \in G'}(c_e) = 4$). Group 1 has $(m+1)$ teams, hence, total cost $\leq (2c_{max})m(m+1) = 8m(m+1)$.

Bhattacharyya/BCC construction: uTTP is NP-hard: Proof of lemma

- ▶ Partition the teams into $10m$ groups, each of size $m + 1$.
Group 1 := the $m + 1$ teams placed on G' .
- ▶ DRR schedule consists of batch of **intra-group** games (with $2m$ games) followed by batch of **inter-group** games.
 - ▶ **Intra-group** games:
 - ▶ **Inter-group** games, Part 1: Construct an “outer” Single Round-Robin (SRR) schedule on the $10m$ groups. Each “outer” game between Groups i, j maps to $(m + 1)$ games where each team of Group i plays against all $(m + 1)$ teams of Group j (i.e., edge-coloring of $K_{m+1, m+1}$ by $(m + 1)$ colors), and
Group i plays @Home \iff each team of Group i plays @Home.
Cost analysis: Assume: Group 1 plays none of its games @Home (each of the $(m + 1)$ teams of Group 1 visits vertex u , plays all its games at u , then returns to G').
Total cost: $\leq (m + 1)2w_u$.
 - ▶ **Inter-group** games, Part 2:

Bhattacharyya/BCC construction: u TTP is NP-hard

Lemma: H has a feasible TTP solution of cost $\leq 20m(m+1)cK$.

Proof of lemma:

- ▶ Partition the teams into $10m$ groups, each of size $m+1$.
- ▶ Group 1 := the $m+1$ teams placed on G' .
- ▶ DRR schedule consists of batch of **intra-group** games (with $2m$ games) followed by batch of **inter-group** games.
 - ▶ **Intra-group** games:
 - ▶ **Inter-group** games, Part 1:
 - ▶ **Inter-group** games, Part 2: Similar to Part 1, but flip Home-Away designations for the “outer” Single Round-Robin (SRR) schedule on the $10m$ groups.

Cost analysis: Assume: Group 1 plays Home (each of the teams at vertex u visits the vertices of G' according to an optimal TSP tour of G' , then returns to u).

Cost incurred by each group at vertex u :

$$(m+1)2w_u + (m+1)cK - cK.$$

$$\text{Total cost: } \leq (10m-1)(2w_u(m+1) + mcK).$$

Bhattacharyya/BCC construction: uTTP is NP-hard

Lemma

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Proof of lemma:

- ▶ Partition the teams into $10m$ groups, each of size $m+1$.
- ▶ Group 1 := the $m+1$ teams placed on G' .
- ▶ DRR schedule consists of batch of **intra-group** games (with $2m$ games) followed by batch of **inter-group** games.
 - ▶ **Intra-group** games:
Cost $\leq 8m(m+1)$.
 - ▶ **Inter-group** games, Part 1:
Cost $\leq (m+1)2w_u$.
 - ▶ **Inter-group** games, Part 2:
Cost $\leq (10m-1)(2w_u(m+1) + mcK)$.
- ▶ **Claim:** Cost of DRR schedule
 $\leq 8m(m+1) + \left((m+1)2w_u + (10m-1)((m+1)2w_u + mcK) \right)$.

Bhattacharyya/BCC construction: $uTTP$ is NP-hard

Recall: Input graph G has edge-costs of 1 or 2.

$K :=$ cost of an optimal TSP tour of G .

Lemma

H has a feasible TTP solution of cost $\leq 20m(m+1)cK$.

Lemma

Suppose the cost of an optimal TSP tour of G is $\geq K + 1$.

Then, any feasible TTP solution of H has cost $> 20m(m+1)cK$.

L-reductions ... for APX-hardness

L-reduction from optimization problem Π_1 to optimization problem Π_2 :

Intent (informal):

α -approximation algorithm for Π_2 \implies $f(\alpha)$ -approximation algorithm for Π_1 ,
for some linear function $f()$

Suppose there is an L-reduction from Π_1 to Π_2 , and suppose Π_1 has **no** β -approximation algorithm (for some $\beta \geq 1$), then Π_2 has **no** $f^{-1}(\beta)$ -approximation algorithm.

L-reductions ... for APX-hardness

L-reduction from optimization problem Π_1 to optimization problem Π_2 :

Definition

Given two optimization problems Π_1 and Π_2 , we say we have an L-reduction from Π_1 to Π_2 if for some parameters $a, b > 0$:

1. For each instance I_1 of Π_1 we can compute in polynomial time an instance I_2 of Π_2 .
2. $\text{OPT}(I_2) \leq a \cdot \text{OPT}(I_1)$.
3. Given a solution of value V_2 to I_2 , we can compute in polynomial time a solution of value V_1 to I_1 such that

$$|\text{OPT}(I_1) - V_1| \leq b \cdot |\text{OPT}(I_2) - V_2|$$

L-reductions ... for APX-hardness

Fact:

- ▶ Suppose there is an L-reduction, with parameters a, b , from minimization problem Π_1 to minimization problem Π_2 , and
 - ▶ suppose there is an α -approximation algorithm for Π_2 ,
 - ▶ then there is an $(1 + ab(\alpha - 1))$ -approximation algorithm for Π_1 .
-

- ▶ Instance l_1 of $\Pi_1 \implies$ instance l_2 of Π_2 .
- ▶ Compute solution S_2 to l_2 of value $V_2 \leq \alpha \text{OPT}(l_2)$.
- ▶ “Map” S_2 to a solution S_1 of l_1 of value V_1 such that

$$\begin{aligned} V_1 &\leq \text{OPT}(l_1) + b(V_2 - \text{OPT}(l_2)) \\ &\leq \text{OPT}(l_1) + b(\alpha \text{OPT}(l_2) - \text{OPT}(l_2)) \\ &= \text{OPT}(l_1)(1 + ab(\alpha - 1)) \end{aligned}$$

TTP is APX-hard: L-reduction from $m(m+1)\otimes\text{TSP}(1,2)$

- ▶ L-reduction from Π_1 to Π_2 , where
- ▶ Π_1 is the “ $m(m+1)\otimes\text{TSP}$ ” on input graph G which has edge-costs of 1 or 2.
OBJ = $m(m+1)$ times cost of an optimal TSP tour of G , where $m = c(n-1) + 1$ and $n = |V(G)|$.
- ▶ Π_2 is TTP on the graph H .

(Recall: G' is the metric-completion of $G^{(c)}$, where $G^{(c)}$ is the “one-sum” of $c > 5$ copies of G with common vertex v . H is obtained from G' by adding a new vertex u , adding the edges ux , for all vertices x of G' , and taking the cost of each new edge to be $w_u = (cK - 1)/2$.)

TTP is APX-hard: L-reduction from $m(m+1)\otimes\text{TSP}(1,2)$

- ▶ L-reduction from Π_1 to Π_2 , where
- ▶ Π_1 is the “ $m(m+1)\otimes\text{TSP}$ ” on G (edge-costs $\in \{1,2\}$).
OBJ = $m(m+1)$ times cost of an optimal TSP tour of G .
- ▶ Π_2 is TTP on the graph H .

Recall the three conditions for an L-reduction with parameters $a, b > 0$:

1. For each instance I_1 of Π_1 we can compute in polynomial time an instance I_2 of Π_2 .
2. $\text{OPT}(I_2) \leq a \cdot \text{OPT}(I_1)$.
3. Given a solution of value V_2 to I_2 , we can compute in polynomial time a solution of value V_1 to I_1 such that

$$|\text{OPT}(I_1) - V_1| \leq b \cdot |\text{OPT}(I_2) - V_2|$$

TTP is APX-hard: L-reduction from $m(m+1)\otimes\text{TSP}(1,2)$

- ▶ L-reduction from Π_1 to Π_2 , where
- ▶ Π_1 is the " $m(m+1)\otimes\text{TSP}$ " on G (edge-costs $\in \{1, 2\}$).
OBJ = $m(m+1)$ times cost of an optimal TSP tour of G .
- ▶ Π_2 is TTP on the graph H .

Recall the third conditions for an L-reduction with parameters $a, b > 0$:

Given a solution of value V_2 to I_2 , we can compute in polynomial time a solution of value V_1 to I_1 such that

$$|\text{OPT}(I_1) - V_1| \leq b \cdot |\text{OPT}(I_2) - V_2|$$

Lemma

Given a TTP schedule S of H with additive slack Δ (i.e., $\text{cost}(S) - \text{OPT}_{\text{TTP}}(H) \leq \Delta$), one can construct a TSP tour T of G with additive slack $\leq 10\Delta$ (i.e., $\text{cost}(T) - \text{OPT}_{\text{TSP}}(G) \leq 10\Delta$).

TTP is APX-hard: L-reduction from $m(m+1) \otimes \text{TSP}(1,2)$

- ▶ L-reduction from Π_1 to Π_2 , where
- ▶ Π_1 is the " $m(m+1) \otimes \text{TSP}$ " on G (edge-costs $\in \{1,2\}$).
OBJ = $m(m+1)$ times cost of an optimal TSP tour of G .
- ▶ Π_2 is TTP on the graph H .

Lemma

Given a TTP schedule S of H with additive slack Δ (i.e., $\text{cost}(S) - \text{OPT}_{\text{TTP}}(H) \leq \Delta$),
one can construct a TSP tour T of G with additive slack $\leq 10\Delta$
(i.e., $\text{cost}(T) - \text{OPT}_{\text{TSP}}(G) \leq 10\Delta$).

Claim

Given an **optimal** TTP schedule S of H ,
one can construct a TSP tour T of G that is **optimal**.

Claim

Given a **non-optimal** TTP schedule S of H ,
one can construct a TSP tour T of G such that
 $\text{cost}(T) - \text{OPT}_{\text{TSP}}(G) \leq 10 (\text{cost}(S) - \text{OPT}_{\text{TTP}}(H))$.

TTP: Results & Open Question

- ▶ (BCC) (unrestricted) TTP is APX-hard.
($\implies \nexists$ PTAS, assuming $\mathbf{P} \neq \mathbf{NP}$)
-
- ▶ (**Open**) 3-restricted TTP is APX-hard?
(Thielen, Westphal TCS'11) proved 3-restricted TTP is NP-hard.
 - ▶ Prove Hardness-of-Approximation results for other variants of TTP.
 - ▶ Design improved approximation algorithms for variants of TTP.
 - ▶ Concorde-Plus to optimally solve TTP instances with 100 teams?