# Spanning Tree, Matching, and TSP for Moving Points: Complexity and Regret 

Nathan Wachholz, Subhash Suri
University of California, Santa Barbara

## Motivation

## We often want to connect objects in space



Minimum Spanning Tree


Minimum Matching


Traveling Salesman Path

## Motivation

What if our objects are moving?

- Motion known in advance
- Straight line
- Constant speed
- $t \in[0,1]$



## Motivation

When the points move, so does the optimal structure
Updating may be impossible, or computationally expensive


Kinetic MST

## Motivation

What if we precompute a single, topologically fixed, spanning tree?
We care about the maximum length of a structure throughout the motion
Want to find the structure whose maximum length is as small as possible
Fixing the initial MST:


## Motivation

This work builds upon Akitaya et. al.'s "The Minimum Moving Spanning Tree Problem" who

- Showed finding an MMST is NP-Hard in 2D
- Gave a $(2+\varepsilon)$-approximation in $O(n \log n)$ time

Our Work:

- Can motion restriction make MMST tractable?
- How bad is an MMST compared to a Kinetic MST?
- What about other structures?
- Other metrics?


## Restrict points to 1D

All points are on the line
They move to the left or right

NP-Hard to find an MMST in 1D

## Restrict points to 1D, unit speed

All points are on the line
They move 1 unit to the left or 1 unit to the right

NP-Hard to find an MMST in 1D under unit speed

## Consider the regret of a structure

How bad is a single structure compared to an updating one?

- $w(T)=$ the max cost of static tree $T$
- $w(K)=$ the max cost of a Kinetic MST
- Regret of $T$ is $r(T)=w(T) / w(K)$


MMST


Kinetic MST

## Consider the regret of a structure

There exists a set of $n$ points in 1D with regret $\Omega(\sqrt{ } n)$
Regret is unbounded in 1D

But under unit speed motion, constant regret bound
Regret is strictly 2-bounded in 1D under unit speed

## Other structures: Minimum Matching, Traveling Salesman

Also NP-Hard in 1D under unit speed
Also have unbounded regret in 1D at arbitrary speeds
TSP regret is 2-bounded for unit speed on a line
Matching regret is not 2-bounded (we don't know what it is; 2.2 is our worst so far)

## Other metrics

Original paper gave an alternative metric that was tractable:

- Minimum bottleneck moving spanning tree (MBMST)
- Naively $O\left(n^{2}\right)$, recent paper brought this to $O\left(n^{4 / 3} \log ^{3} n\right)$

We introduced another intuitive metric:

- Minimum average moving spanning tree (MAMST)
- Also naively $O\left(n^{2}\right)$


## 1D MMST Hardness Reduction

Let's take a peek at the details of this reduction

## MMST is Hard in 1D - Preliminaries

Akitaya et. al. showed the distance between moving points is convex
The weight of a tree is a convex function
Therefore the maximum weight of a tree occurs at $t=0$ or $t=1$



## MMST is Hard in 1D - Single Gadget

Consider an MMST on the following 5 moving points in 1D


## MMST is Hard in 1D - Single Gadget

Then there are two locally minimal options:


Initial: $\mathrm{w}_{\mathrm{T}}(0)=4.75$
Final: $\mathrm{w}_{\mathrm{T}}(1)=5.25$

Initial: $\mathrm{w}_{\mathrm{T}}(0)=5.25$
Final: $w_{T}(1)=4.75$

## MMST is Hard in 1D - Single Gadget

We can modify the points to adjust the costs
The difference between $w_{T}(0)$ and $w_{T}(1)$ can vary from 0 to 0.5


## MMST is Hard in 1D - Multiple Gadgets

What if we have multiple gadgets?
Each gadget has 2 locally optimal configurations


## MMST is Hard in 1D - Multiple Gadgets

An MMST is a combination of the subtrees on each gadget
Maximum cost of the tree is determined by the configuration of the gadgets In this example, $w_{T}(0)=w_{T}(1)=w(T)=10+1=11$


## MMST is Hard in 1D - Partition Problem

We will reduce from the Partition Problem, which is NP-Hard:
Given a list $\left(a_{0}, a_{1}, \ldots, a_{n-1}\right)$ of $n$ integers,
Partition them into two lists that have the same sum
Example:

$$
(1,2,5,6,10) \rightarrow(1,5,6) \text { and }(2,10)
$$

We can also normalize:

$$
(0.1,0.2,0.5,0.6,1) \rightarrow(0.1,0.5,0.6) \text { and }(0.2,1)
$$

## MMST is Hard in 1D - Putting it together

Now create a gadget $S_{i}$ for each value $a_{i}$ (normalized)
Consider an MMST on the gadgets
There is a subtree $T_{i}$ on each gadget, in one of two configurations:

- Left: $\quad w_{T i}(0)=5-a_{i} / 4 \quad$ and $\quad w_{T i}(1)=5+a_{i} / 4$
- Right: $w_{T i}(0)=5+a_{i} / 4$ and $w_{T i}(1)=5-a_{i} / 4$

Let $L=\left\{i \mid T_{i}\right.$ is Left $\}$ and $R=\left\{i \mid T_{i}\right.$ is Right $\}$


## MMST is Hard in 1D - Putting it together

Let $L=\left\{i \mid T_{i}\right.$ is Left $\}$ and $R=\left\{i \mid T_{i}\right.$ is Right $\}$
$\begin{array}{llll}\text { - Left: } & w_{T i}(0)=5-a_{i} / 4 & \text { and } & w_{T i}(1)=5+a_{i} / 4 \\ - & \text { Right: } & w_{T i}(0)=5+a_{i} / 4 & \text { and }\end{array}$

- Right: $\quad w_{T i}(0)=5+a_{i} / 4 \quad$ and $\quad w_{T i}(1)=5-a_{i} / 4$

The cost of all subtrees is:

$$
\begin{gathered}
w(0)=5 n-\sum_{i \in L} \frac{a_{i}}{4}+\sum_{i \in R} \frac{a_{i}}{4} \quad w(1)=5 n+\sum_{i \in L} \frac{a_{i}}{4}-\sum_{i \in R} \frac{a_{i}}{4} \\
w(\text { subtrees })=\max \{w(0), w(1)\}=5 n+\left|\sum_{i \in L} \frac{a_{i}}{4}-\sum_{i \in R} \frac{a_{i}}{4}\right|
\end{gathered}
$$

## MMST is Hard in 1D - Putting it together

So we find an MMST, and ask if its weight is $6 n-1$
If it is, then we know there is a solution to the partition problem
Can easily get the solution by looking at the MMST


## MMST is Hard in 1D

MMST is Hard in 1D!
Even if all points move at the same speed!


## Regret is Unbounded for General 1D Motion

We can construct a set of points to achieve any desired regret ratio
Say our target regret is $b=2$. Define $k=2 b=4$.
Let $p_{i, j}$ denote a 1D moving point that starts at $i$ and ends at $j$.
Let $S$ be the set of all $p_{i, j}$ for $0 \leq i, j \leq k$.
Here's what they look like for $b=2$ :


## Regret is Unbounded for General 1D Motion

Let's imagine each 1D moving point as a static point in 2D
Put each $p_{i, j}$ at $P_{i, j}=(i, j)$. Now we have a grid:


Project onto the $x$-axis to get initial positions, or the $y$-axis for final positions

## Regret is Unbounded for General 1D Motion

Now imagine a tree on the 2D points:


Initial: $\mathrm{w}_{\mathrm{T}}(0)=4$
Final: $w_{T}(1)=20$

Map the tree back to the 1D points and:

- initial cost is the sum of its horizontal components
- final cost is the sum of its vertical components


## Regret is Unbounded for General 1D Motion

The best we could do is $w(T)=12$.
A kinetic MST will always have cost $w(K)=4$ :


So in this example, regret is always at least $3>b=2$.

## Regret is Unbounded for General 1D Motion

We can generalize for any $b>1$. Define $k=2 b$.
Any fixed tree has a maximum cost of at least $\left((k+1)^{2}-1\right) / 2>k^{2} / 2$
A kinetic MST has fixed cost $k$
So regret is at least $k^{2} / 2 k=k / 2=b$
The construction with n points gives a $\boldsymbol{\Omega}(\sqrt{ } n)$ regret ratio for general 1D motion


## Regret is Bounded for Unit Speed in 1D

## Regret of an MMST on 1D, unit speed moving points is no more than 2

## Basic idea:

- Connect Leftwards-moving points
- Connect Rightwards-moving points
- Add an edge connecting them
- Each is always less than the dynamic cost (3-bound)

Being more careful gives a 2-bound


## Open Problems

Regret bound of unit speed minimum matching
Regret bound in higher dimensions (unit speed or otherwise)
MAMST faster than $O\left(n^{2}\right)$
Partially-kinetic structures (allow n updates to the structure)

## Thank you!

Any questions?

