# Hitting Families of Schedules 

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## Ninjas at a conference banquet



A banquet is complete if for every pair of ninjas (i, $\mathbf{j}$ ), there's a course served to ninja i before ninja $\mathbf{j}$. How many courses make a banquet complete?

## Ninjas at a conference banquet

Two courses suffice:


1


2

n


## Ninjas at a conference banquet

What if ninjas form a hierarchy?
A master is always served before their student.


## Ninjas at a conference banquet

Again, two courses suffice:


## Ninjas at a conference banquet

What if instead of pairs we consider triplets of ninjas?
A banquet is 3-complete if for every triplet of ninjas ( $\mathbf{i}, \mathbf{j}, \mathbf{k}$ ), there's a course served to ninja $\mathbf{i}$ before $\mathbf{j}$, and $\mathbf{j}$ before $\mathbf{k}$.

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Naive approach with $\mathbf{2 n}$ courses:
for each i@\{1,..., n\}:
serve ancestry line to i; ldfs the rest serve ancestry line to i; rdfs the rest

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Can be done with $\mathbf{O}(\log \mathbf{n})$ courses!

## From ninjas to concurrent systems


ninjas
hierarchy
courses
d-complete banquet

events partial order
schedules
d-hitting family of schedules

## d-hitting families of schedules

Given a poset of events, a schedule hits a d-tuple of events $\left(\mathbf{e}_{1}, \ldots, \mathbf{e}_{\mathbf{d}}\right)$ if it executes the events in the order $\mathbf{e}_{1}<\ldots<\mathbf{e}_{d}$.

Given a poset of events, a family of schedules $\mathbf{F}$ is d-hitting if for every admissible d-tuple of events there is a schedule in $\mathbf{F}$ that hits it.

## Why d?

Empirically: Many bugs involve small number of events-bug depth d
[Lu et al. ASPLOS '08] [Burckhardt et al. ASPLOS '10] [Jensen et al. OOPSLA '15] [Qadeer et al. TACAS '05]

- $d=2$ : order violation
- $d=3$ : atomicity violation

A d-hitting family of schedules provides a notion of coverage: it hits any bug of depth d.

Moreover, for certain kinds of partial orders we can explicitly construct small d-hitting families.

## Contributions

© The notion of d-hitting families of schedules
© For antichains with $n$ elements, existence of hitting families of size $\mathbf{O}(\exp (\mathbf{d}) \cdot \log \mathbf{n})$

- For trees of height $h$ :
- $d=3$ : explicit construction of hitting families of size $\mathbf{4 h}$ (optimal)
- $d>3$ : explicit construction of hitting families of size $\mathbf{O}\left(\exp (\mathbf{d}) \cdot \mathbf{h}^{\mathbf{d}-1}\right)$


## Contributions

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6. For antichains with $n$ elements, existence of hitting families of size $\mathbf{O}(\exp (\mathrm{d}) \cdot \log \mathbf{n})$

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## Why trees?



Trees arise from a simple fire-and-forget model of asynchronous programs.

## 3-hitting families for trees


admissible (a,b,c)

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## 3-hitting families for trees



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\begin{aligned}
& \text { admissible }(a, b, c) \\
& d=\operatorname{lca}(a, c) \quad(\text { could be a itself })
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admissible (a,b,c)
$d=\operatorname{lca}(a, c) \quad(c o u l d$ be a itself)
for each i@\{0,..,h-1\}:
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& \text { ldfs blocking left@i; ldfs the rest } \\
& \text { rdfs blocking right@i; rdfs the rest } \\
& \text { rdfs blocking left@i; rdfs the rest } \\
& \text { Total: 4h schedules } \\
& \text { (4•log } \mathbf{n} \text { for a balanced tree) }
\end{aligned}
$$

## $d$-hitting families for $\mathrm{d} \geq 4$



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admissible $\left(x_{1}, \ldots, x_{d}\right)$
$\mathrm{D}=$ Ica-closure $\left(\mathrm{x}_{1}, \ldots, \mathrm{x}_{\mathrm{d}}\right) \quad$ (an ordered tree)
$\mathrm{i}_{1}, \ldots, \mathrm{i}_{\mathrm{k}}$ - levels of D's internal nodes

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$\mathrm{i}_{1}, \ldots, \mathrm{i}_{\mathrm{k}}$ - levels of D's internal nodes
$\pi$ - schedule of $D$ that hits $\left(x_{1}, \ldots, x_{d}\right)$
( $D, i_{1}, \ldots, i_{k}, \pi$ ) is a pattern:

- determines a partition of the tree
- by scheduling parts according to $\pi$, determines a schedule that hits $\left(\mathrm{x}_{1}, \ldots, \mathrm{x}_{\mathrm{d}}\right)$
height $h$


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admissible ( $\mathrm{x}_{1}, \ldots, \mathrm{x}_{\mathrm{d}}$ )
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- determines a partition of the tree
- by scheduling parts according to $\pi$, determines a schedule that hits $\left(\mathrm{x}_{1}, \ldots, \mathrm{x}_{\mathrm{d}}\right)$
for each pattern:
schedule according to pattern


## d-hitting families for $d \geq 4$

Claim. For any nodes $x_{1}, \ldots, x_{d},|D| \leq 2 d-1$. Moreover, $D$ has at most $d-1$ internal nodes.

Accounting:

- at most $\exp (\mathbf{d})$ ordered trees with $2 \mathrm{~d}-1$ nodes
- at most h $\mathbf{h}^{\text {d-1 }}$ choices for levels $i_{1}, \ldots, i_{d-1}$
- at most d! schedules $\pi$

Total: at most $\exp (\mathbf{d}) \cdot \mathbf{d}!\cdot \mathbf{h}^{\mathbf{d}-1}$ patterns

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Total: at most $\exp (\mathbf{d}) \cdot \mathbf{d}!\cdot \mathbf{h}^{\mathbf{d}-1}$ patterns
Note: For $d=3$, this is $O\left(h^{2}\right)$ instead of $O(h)$ schedules

# From hitting families to systematic testing 

## Posets of events need not be static

- Use on-the-fly constructions as a heuristic


## Beyond trees

- Our results extend to series-parallel graphs
- In general, even the case of d=2 is difficult (order dimension [Dushnik \& Miller, '41])


## Unbalanced trees

- Height h can be close to number of nodes n
- Use domain-specific properties to first reduce the poset


## Summary

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© For antichains with $n$ elements, existence of hitting families of size $\mathbf{O}(\exp (\mathbf{d}) \cdot \log \mathbf{n})$

- For trees of height h :
- $d=3$ : explicit construction of hitting families of size $\mathbf{4 h}$ (optimal)
- $d>3$ : explicit construction of hitting families of size $\mathbf{O}\left(\exp (\mathbf{d}) \cdot h^{d-1}\right)$
http://www.mpi-sws.org/~fniksic/

