# Pattern Matching with Variables: <br> A Multivariate Complexity Analysis 

Henning Fernau, Markus L. Schmid, Universität Trier

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## Words with Coloured Holes

A word with (coloured) holes. . .

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\mathrm{ab} \square \mathrm{c} \square \mathrm{cb} \square \mathrm{~b} \square \mathrm{ca} \square
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...can be repaired...

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...can be repaired...

$$
\begin{aligned}
\mathrm{ab} \mathrm{a} & \rightarrow \square \\
\mathrm{c} \mathrm{~b} & \rightarrow \square
\end{aligned}
$$

... by filling in new words:

$$
a b a b a c c b c b a b a b c b c a c b
$$

## A Special Kind of Pattern Matching

For given
$\alpha$ (a word with coloured holes),
$w$ (a word without holes),
is it possible to fill the holes of $\alpha$ in such a way that we obtain $w$ ?

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Example 1:

$$
\begin{aligned}
\alpha & =\square \mathrm{a} \mathrm{a} \square \square \square \mathrm{cb} \square \\
\mathrm{u} & =\mathrm{ac} \mathrm{a} \mathrm{a} \mathrm{abcbaacabcbacbac}
\end{aligned}
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Example 2:

$$
\begin{aligned}
\alpha & =\square \mathrm{a} \mathrm{a} \square \square \square \mathrm{c} \square \square \\
\mathrm{v} & =\mathrm{c} \mathrm{c} \mathrm{~b} \mathrm{a} \mathrm{accbc} \mathrm{c} \mathrm{c} \mathrm{c} \mathrm{~b}
\end{aligned}
$$

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$$
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\end{aligned}
$$

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$$
\begin{aligned}
\alpha & =\mathrm{c} \mathrm{cbaaccbcbccb} \\
v & =\mathrm{c} \mathrm{cbaaccbcbccb}
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Example 3:

$$
\begin{aligned}
& \alpha=\square \mathrm{a} \mathrm{a} \square \square \square \mathrm{c} \square \square \\
& \mathrm{w}=\mathrm{abba} \mathrm{ababc} \mathrm{abc}
\end{aligned}
$$

## Some Notations and Definitions

$\Sigma$ is a terminal alphabet,

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\Sigma=\{a, b, c\}
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abaacba
$\alpha:=x_{1} \mathrm{a} x_{2} x_{1} \operatorname{bax}_{2} x_{1} x_{3}$

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$\alpha \in(\Sigma \cup X)^{+}$is a pattern
$X \rightarrow \Sigma^{+}$is a substitution

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X=\left\{x_{1}, x_{2}, x_{3}, \ldots\right\}
$$

$\alpha:=x_{1} \operatorname{ax} x_{2} x_{1} \operatorname{bax}_{2} x_{1} x_{3}$

$$
h\left(x_{1}\right):=\mathrm{ab}, h\left(x_{2}\right):=\mathrm{bcc}
$$

## Pattern Matching with Variables

VPatMatch
Instance: $A$ pattern $\alpha \in(\Sigma \cup X)^{*}$, a word $w \in \Sigma^{*}$.
Question: Does there exist a substitution $h$ with $h(\alpha)=w$ ?

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Instance: A pattern $\alpha \in(\Sigma \cup X)^{*}$, a word $w \in \Sigma^{*}$.
Question: Does there exist a substitution $h$ with $h(\alpha)=w$ ?
Two variants:
E-VPatMatch Substitution may map variables to the empty word $\varepsilon$.
NE-VPatMatch Substitution can only map to non-empty words.

## A Very Brief History

Three branches:

- Learning theory and Language theory (1980-today):
- Membership problem of Angluin's pattern languages.
- First NE-case, later E-case.
- Word equations, where one side is "variable-free".


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- Pattern matching community (1996-today):
- Baker's parameterised matching (finding repetitions in program code).
- A. Amir, Y. Aumann, R. Cole, M. Lewenstein: function matching.
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- Only NE-case.
- The "real" world (?? - today):
- Matchtest for regular expressions with backreferences.
- Nowadays a standard tool in text editors (grep, emacs, ...) and programming language (Perl, Java, Python, ...).


## NP-Completeness

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3CNF formula (without negated variables)

$$
\psi=\left(v_{1} \vee v_{2} \vee v_{3}\right) \wedge\left(v_{2} \vee v_{4} \vee v_{5}\right) \wedge\left(v_{3} \vee v_{1} \vee v_{3}\right) \wedge\left(v_{4} \vee v_{1} \vee v_{2}\right)
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$$

E-VPatMatch instance:

$$
\begin{aligned}
& \alpha_{\psi}=x_{1} x_{2} x_{3} \mathrm{~b} x_{2} x_{4} x_{5} \mathrm{~b} x_{3} x_{1} x_{3} \mathrm{~b} x_{4} x_{1} x_{2} \\
& w_{\psi}=\mathrm{abababa}
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$\exists h: h\left(\alpha_{\psi}\right)=w_{\psi}$ iff $\psi$ is "1-in-3-satisfiable".

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- we are only interested in texts of size at most 50 ,
- we are only interested in injective substitutions,
- in our patterns every variable occurs at most twice,
- we are only interested in patterns without any terminal symbols and we only consider substitutions of the form $h: X \rightarrow\{a, b, \varepsilon\}$ ? (i. e., for some $u$ over some alphabet $\Gamma$ and some $w \in\{a, b\}^{*}$, can we obtain $w$ by replacing every $x \in \Gamma$ in $u$ by either a or b or deleting it?)


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$\operatorname{var}(\alpha)$ is the set of variables in $\alpha$
$|\alpha|_{x}$ is the number of Occ. of $x$ in $\alpha$

$$
\begin{array}{r}
\operatorname{var}(\alpha)=\left\{x_{1}, x_{2}, x_{3}\right\} \\
|\alpha|_{x_{1}}=3
\end{array}
$$

## Different Versions

Types of VPatMatch:

- Substitutions can be erasing or must be non-erasing.


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$|\alpha|_{x}$ Max. occ. per variable.
$|\Sigma|$ Alphabet size.
$2^{3}$ types, $2^{5}$ combinations of parameters $\rightarrow 256$ versions of VPATMATch.

## Research Questions

256 Questions of the following form:

## Main Research Question

For any type $X$ of VPatMatch and for any subset $P$ of parameters, can we bound the parameters in $P$ by constants, such that type $X$ of VPatMatch is still NP-complete?

## First Observations

Theorem (Geilke, Zilles, 2011)
If

$$
\begin{aligned}
|\operatorname{var}(\alpha)| & \leq c \text { or } \\
|w| & \leq c
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$$

for some constant $c$, then all variants of VPatMatch are in $P$.

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So we focus on the parameters $|h(x)|,|\alpha|_{x}$ and $|\Sigma|$.

## Observation

If

$$
\begin{aligned}
|\alpha|_{x} & =1 \text { or } \\
|\Sigma| & =1
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$$

then all variants of VPatMatch are in $P$.

## The Non-injective Case

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Erasing, non-injective VPATMATch is NP-complete,

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- even if

$$
\begin{array}{r}
|h(x)| \leq 1, \\
|\alpha|_{x} \leq 2, \\
|\Sigma| \leq 2 .
\end{array}
$$

## The Non-injective Case

## Theorem

Erasing, non-injective VPatMatch is NP-complete,

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$$
\begin{aligned}
|h(x)| & \leq 1, \\
|\alpha|_{x} & \leq 2, \\
|\Sigma| & \leq 2 .
\end{aligned}
$$

- even if terminal-free and

$$
\begin{aligned}
|h(x)| & \leq 1 \\
|\alpha|_{x} & \leq 8 \\
|\Sigma| & \leq 2 .
\end{aligned}
$$

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Erasing, non-injective VPatMatch is NP-complete,

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|\Sigma| & \leq 2 .
\end{aligned}
$$

- even if terminal-free and

$$
\begin{aligned}
|h(x)| & \leq 1 \\
|\alpha|_{x} & \leq \neq 2 \\
|\Sigma| & \leq 2
\end{aligned}
$$

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## Theorem

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## The Non-injective Case

## Theorem

(Non-)Erasing, non-injective VPatMatch is NP-complete,

- even if

$$
\begin{aligned}
|h(x)| & \leq 1(3) \\
|\alpha|_{x} & \leq 2(2) \\
|\Sigma| & \leq 2(2)
\end{aligned}
$$

- even if terminal-free and

$$
\begin{aligned}
|h(x)| & \leq 1(3) \\
|\alpha|_{x} & \leq \neq 2(3) \\
|\Sigma| & \leq 2(4) .
\end{aligned}
$$

## The Injective Case $1 / 2$

Theorem
Let $c_{1}, c_{2} \in \mathbb{N}$. All injective variants of VPatMatch, restricted to

$$
\begin{aligned}
|h(x)| & \leq c_{1}, \\
|\Sigma| & \leq c_{2},
\end{aligned}
$$

are in $P$.

## The Injective Case $2 / 2$

For all other injective variants, we have NP-completeness, but the constants are a bit larger.

## The Injective Case 2/2

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## Theorem

Injective, erasing or non-erasing, terminal-free or non-terminal-free VPatMatch is NP-complete,

- even if

$$
\begin{aligned}
|h(x)| & \leq 19 \\
|\alpha|_{x} & \leq 4,
\end{aligned}
$$

- even if

$$
\begin{aligned}
|\alpha|_{x} & \leq 9 \\
|\Sigma| & \leq 5 .
\end{aligned}
$$

## Further Research $1 / 2$

Main Research Question
For any variant $X$ of VPatMatch and for any subset $P$ of parameters, can we bound the parameters in $P$ by constants, such that variant $X$ of VPatMatch is still NP-complete?

## Further Research $1 / 2$

## Main Research Question

For any variant $X$ of VPatMatch and for any subset $P$ of parameters, can we bound the parameters in $P$ by constants, such that variant $X$ of VPatMatch is still NP-complete?

## Dichotomy Result

For any variant $X$ of VPatMatch, for any subset $P$ of parameters and for any set $C$ of specific bounds for the parameters in $P$, is the variant $X$ of VPatMatch still NP-complete if the parameters of $P$ are bounded by the constants in C?

## Further Research $1 / 2$

## Main Research Question

For any variant $X$ of VPatMatch and for any subset $P$ of parameters, can we bound the parameters in $P$ by constants, such that variant $X$ of VPatMatch is still NP-complete?

## Dichotomy Result for Erasing and Non-injective Case

Let $c_{1}, c_{2}, c_{3} \in \mathbb{N}$. Erasing, non-injective VPatMatch, restricted to

$$
\begin{aligned}
|h(x)| & \leq c_{1}, \\
|\alpha|_{x} & \leq c_{2}, \\
|\Sigma| & \leq c_{3},
\end{aligned}
$$

is NP-Complete if and only if $c_{1} \geq 1, c_{2} \geq 2, c_{3} \geq 2$.

## Further Research 2/2

## Parameterized Complexity

Consider the parameters (|var |, | $\Sigma \mid, \ldots$ ) as parameters in terms of parameterized complexity theory and investigate the parameterized complexity of the corresponding parameterized problems.

Thank you very much for your attention.

