

10 February 2025

RNA Folding

Plan.

- * RNA Folding Problem
- * Announcements
- * DP for RNA Folding.

Another problem from biology

RNA Sequences $m \in \{A, U, C, G\}^*$

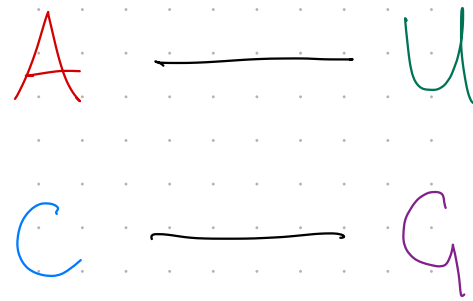
$m = A U U C G G A C G G A A$

Key Question.

What structure does the RNA molecule adopt?

What structure does the RNA molecule adopt?

↳ Base pairing



} allowable pairings.

What structure does the RNA molecule adopt?

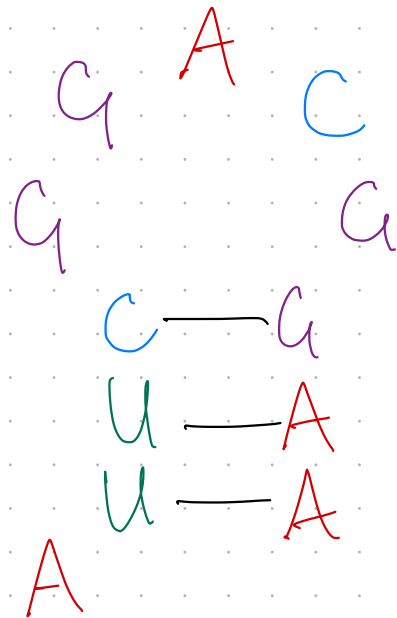
m = A U U C G G A C G G A A

↓ base pairing

What structure does the RNA molecule adopt?

m = A U U C G G A C G G A A

↓ base pairing



Given. RNA Sequence $m \in \{A, U, C, G\}^*$

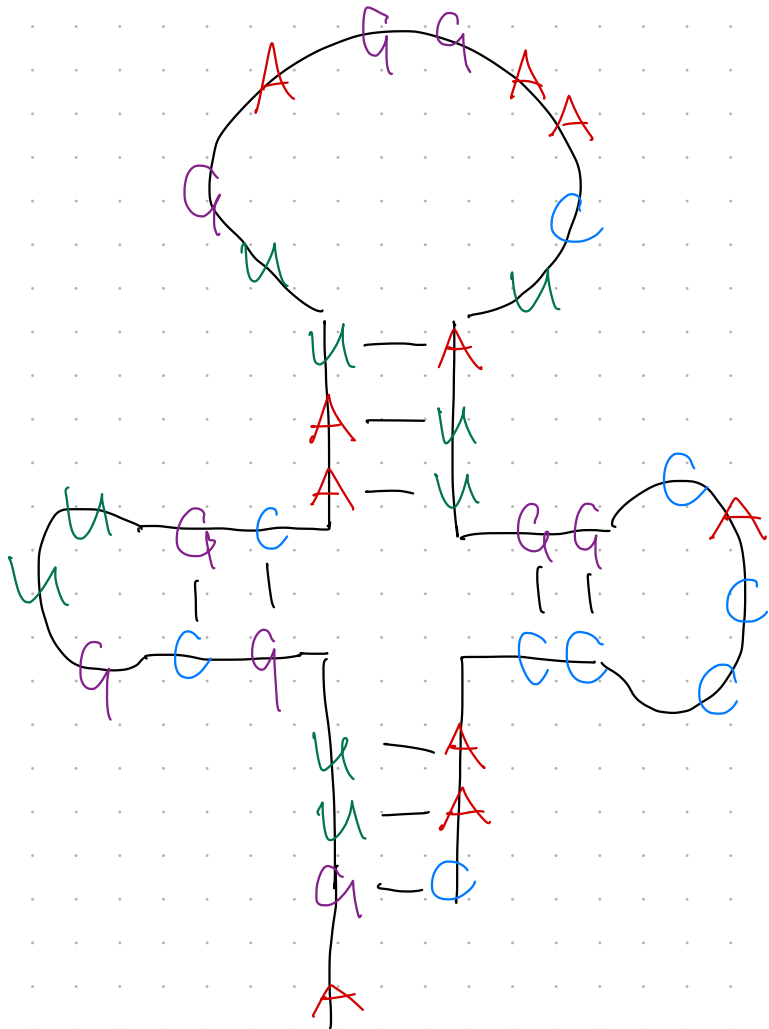
Find. Minimum "energy" structure

A G U U G C G U U G C A A U U G A G G A A C U A U U G G C A C C C C A A C

Given. RNA Sequence $m \in \{A, U, C, G\}^*$

Find. Minimum "energy" structure

A G U U G C G U U G C A A U U G A G G A A C U A U U G G C A C C C C A A C



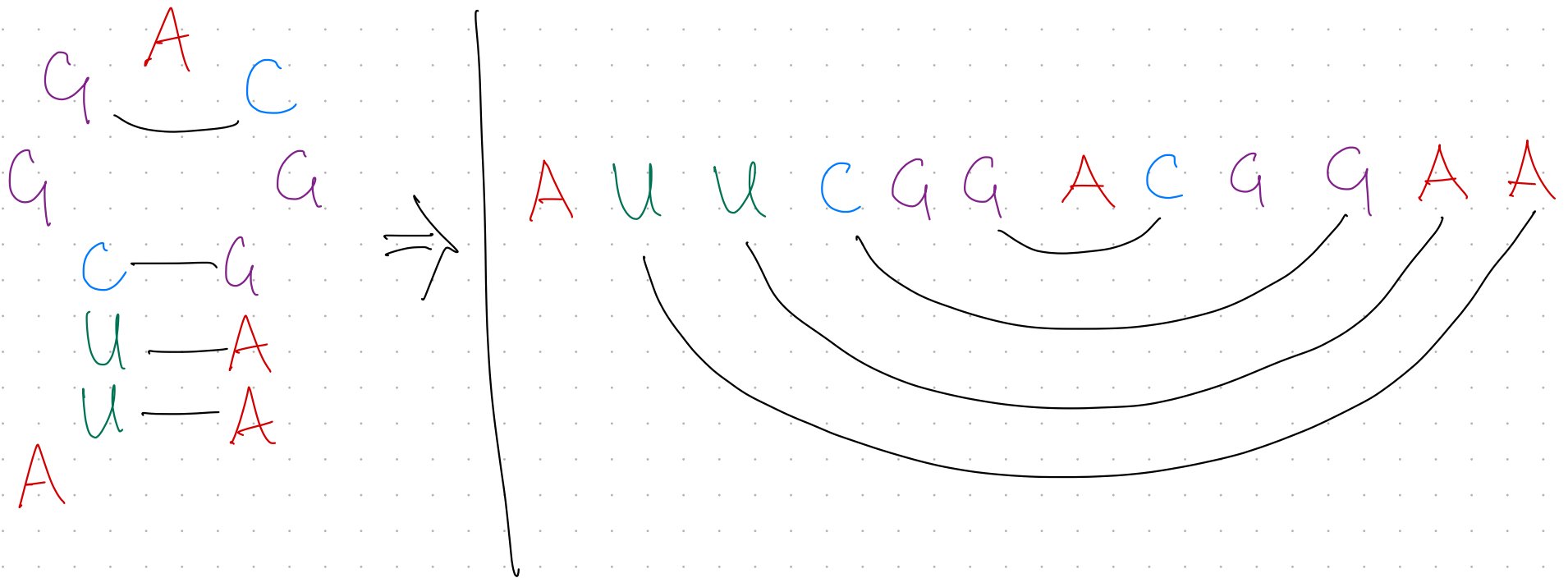
Min "energy"

$\equiv$

Max "legal" base pairing

Given. RNA Sequence $m \in \{A, U, C, G\}^*$

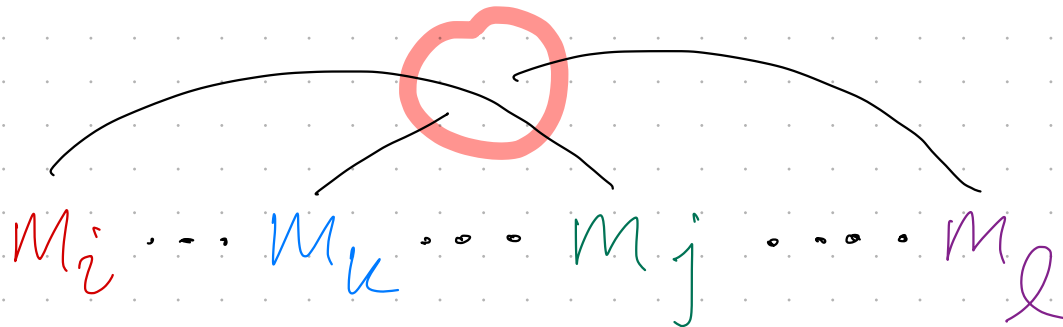
Compute. Maximum Non-crossing matching E
of preferred base pairs within m .



Given. RNA Sequence $m \in \{A, U, C, G\}^*$

Compute. Maximum Non-crossing matching E
of preferred base pairs within m .

Non-crossing. if $(i, j), (k, l) \in E$
then, $\neg (i < k < j < l)$.



Announcements

* HW 2 ongoing

* HW 1 grades released after lecture.

* Prelim 1 This Thursday 7:30-9 p.

* Statler 185

* Statler 196

} See Ed for room assignment.

↳ Coverage through last Friday's lecture.

* Review

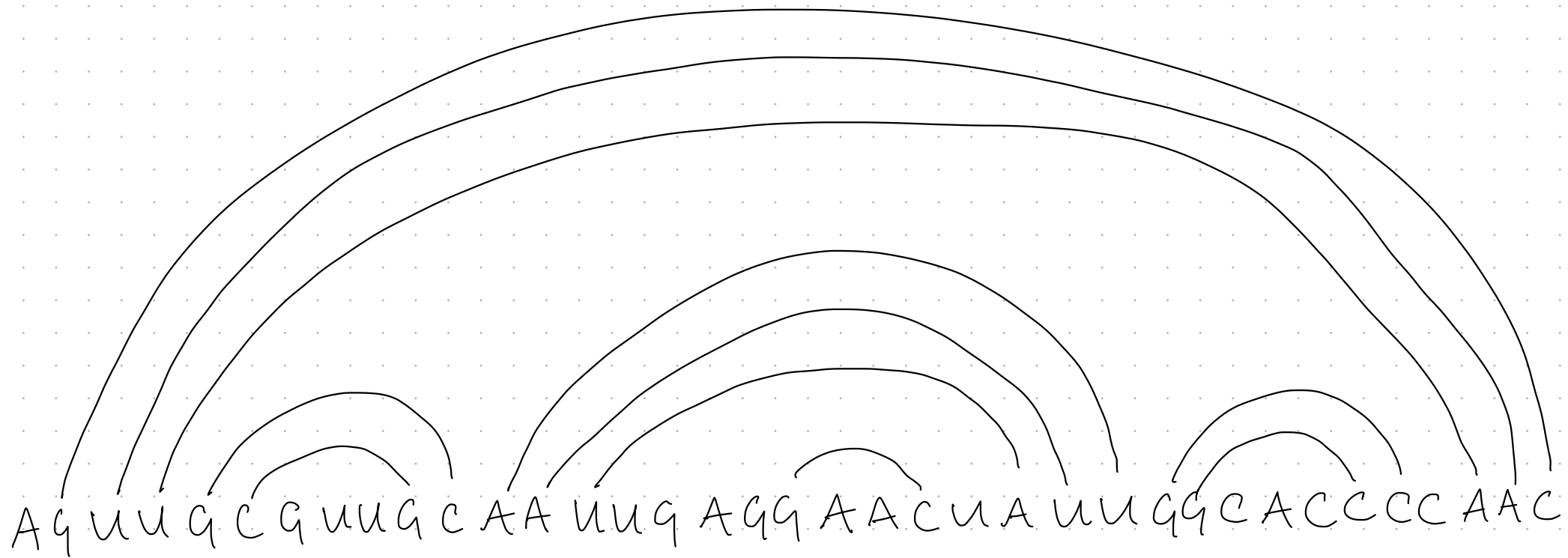
* Practice Exam on Canvas.

* Review Session Tues 7-9 p

↳ Gates 601.

Given. RNA Sequence $m \in \{A, U, C, G\}^*$

Compute. Maximum Non-crossing matching E
of preferred base pairs within m .
 $BP = \{(A, U), (C, G)\}$



What are the cases / subproblems?

Cases In optimal folding of M .

*

*

$M = \text{UUGCAAUUGAGGAAUUAUUUUGGCAACCCCAAC}$

m_1

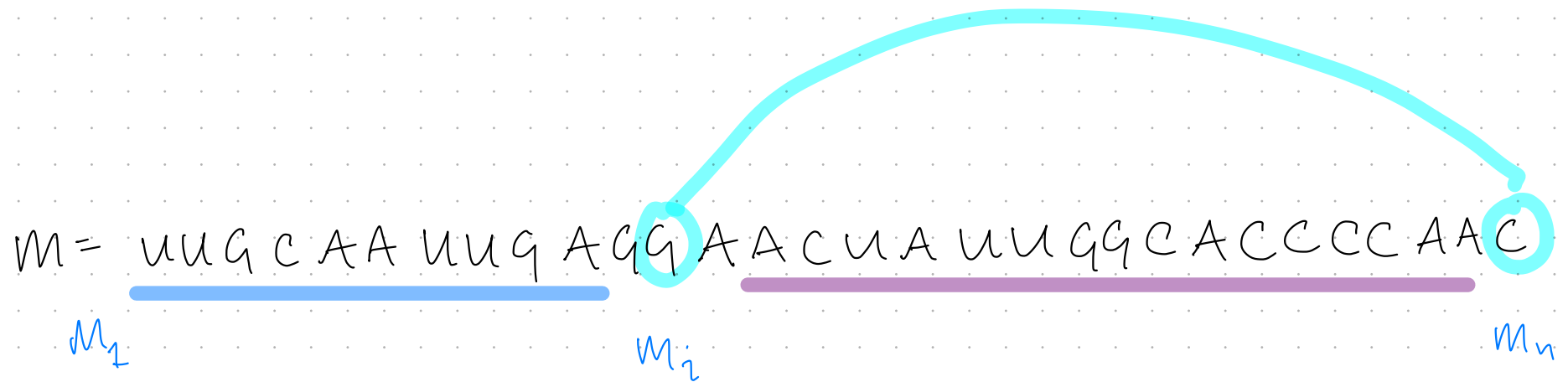
m_n

What happens to m_n ?

Cases In optimal folding of M .

* m_n base pairs w/ some m_i $i < n$, OR

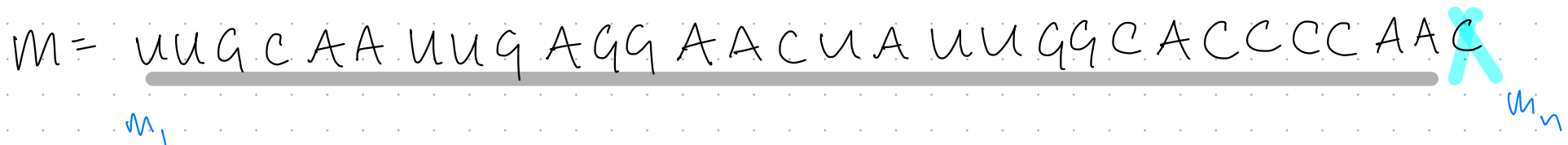
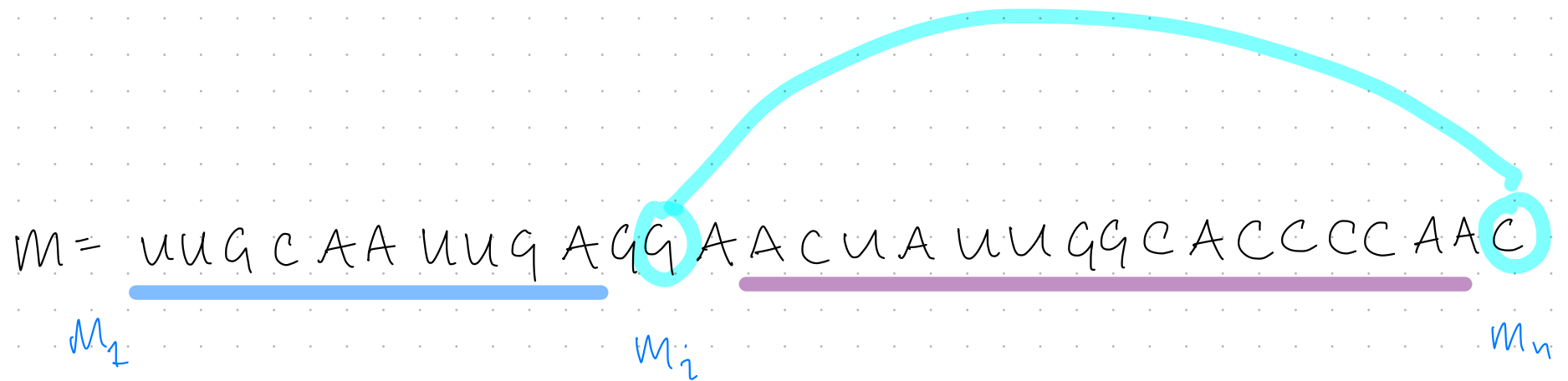
*



Cases In optimal folding of M .

* m_n base pairs w/ some m_i $i < n$, OR

* m_n does NOT base pair

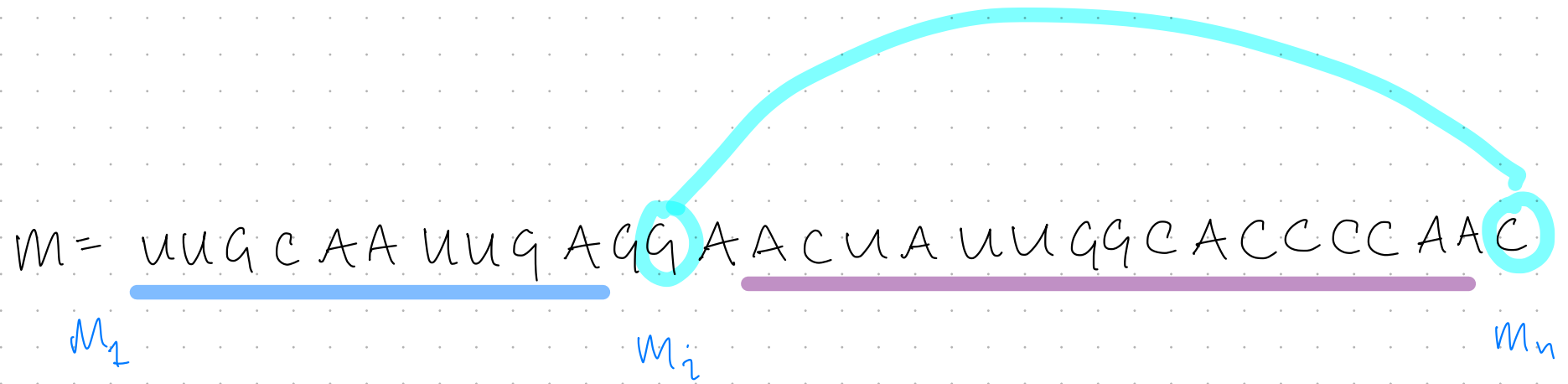


Cases m_n does Not base pair

$M =$ UUGCAAUUGAGGAAUUAUUGGCACCCCAAC m_n

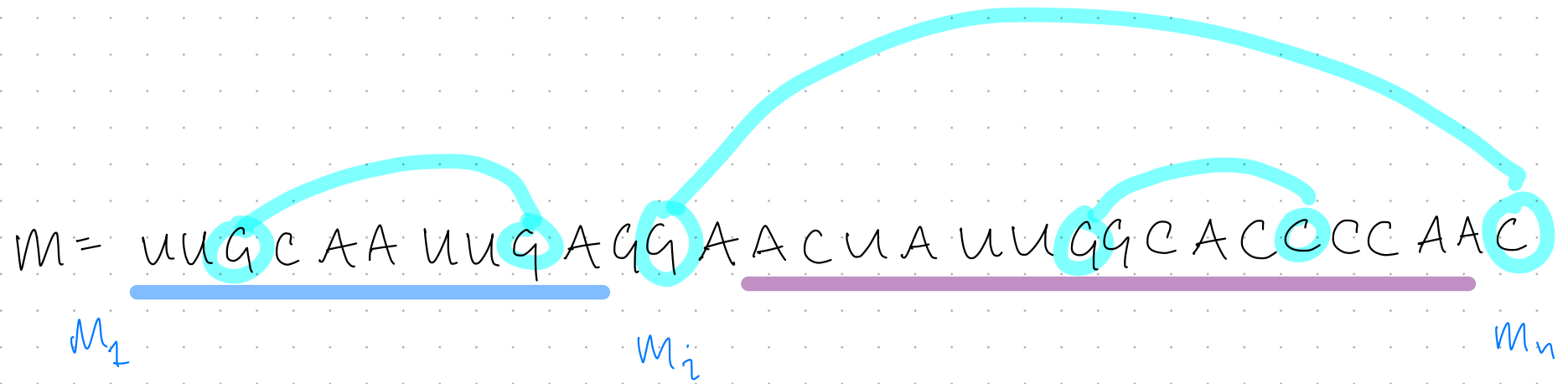
Best up til $M_n =$ Best up til M_{n-1}

Cases m_n base pairs w/ some m_i $i < n$



What base pairs are still legal?

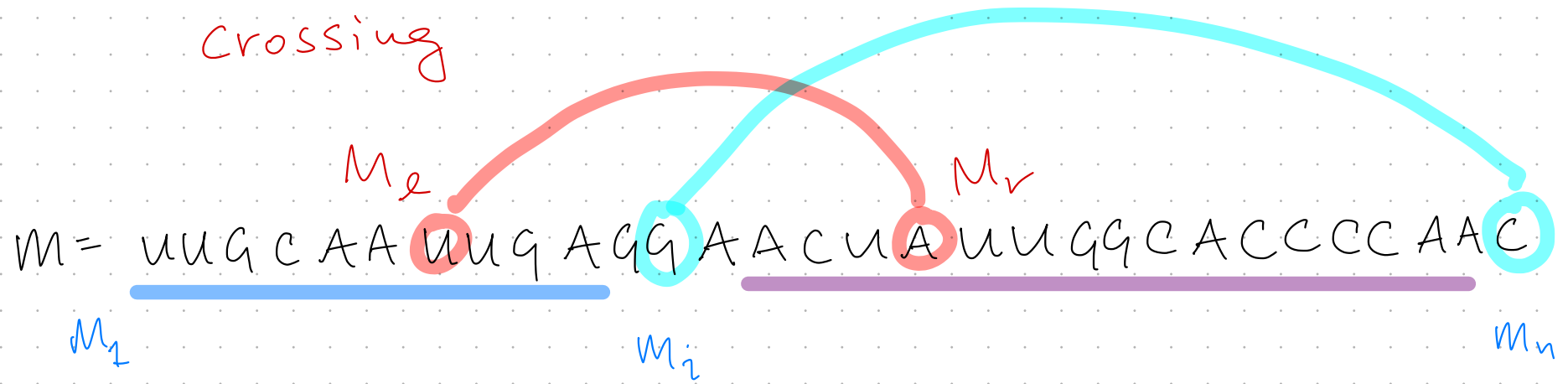
Cases m_n base pairs w/ some m_i $i < n$



What base pairs are still legal?

* ALLOWED: from $M_1 \rightarrow M_{i-1}$ & $M_{i+1} \rightarrow M_{n-1}$

Cases m_n base pairs w/ some m_i $i < n$

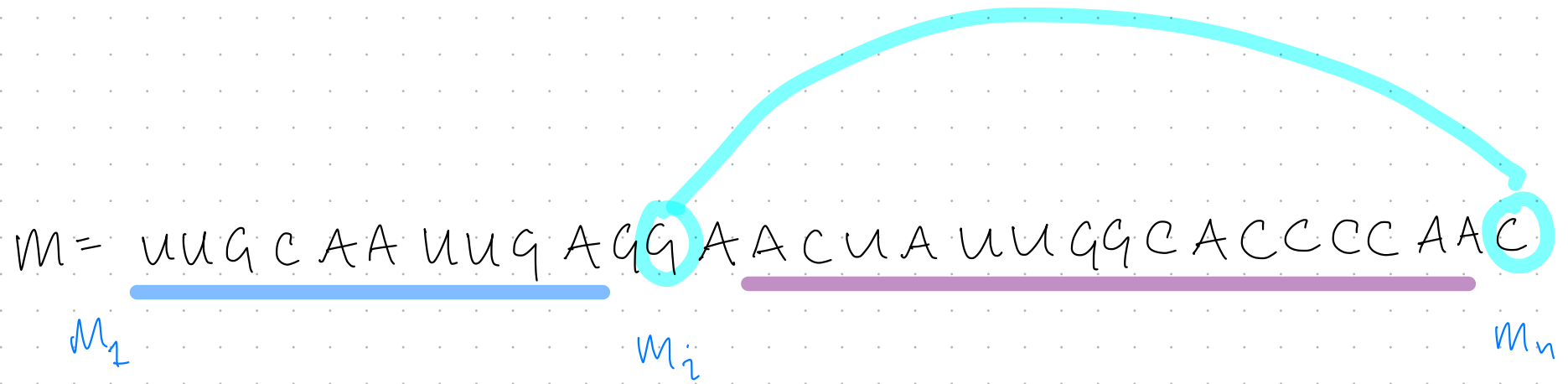


What base pairs are still legal?

* ALLOWED: from $M_1 \rightarrow M_{i-1}$ & $M_{i+1} \rightarrow M_{n-1}$

* NOT ALLOWED: Crossings!
from $M_l \rightarrow M_r$
for $l < i < r$.

Cases m_n base pairs w/ some m_i $i < n$



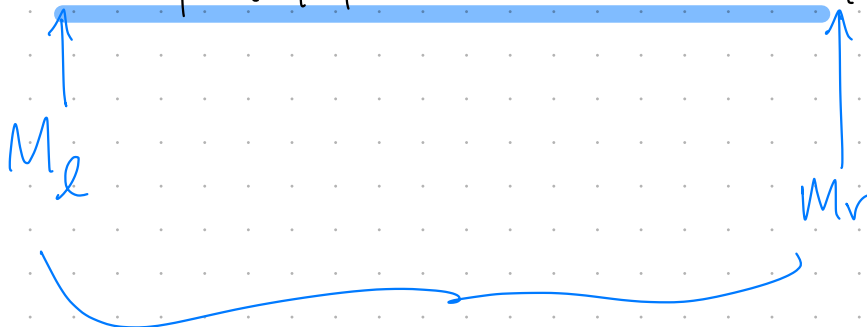
Best for M

=

Best of left + Best of right

Subproblems = Substrings

M = UUGCAAUUGAGGAAUUAUUGGCAACCCAAAC

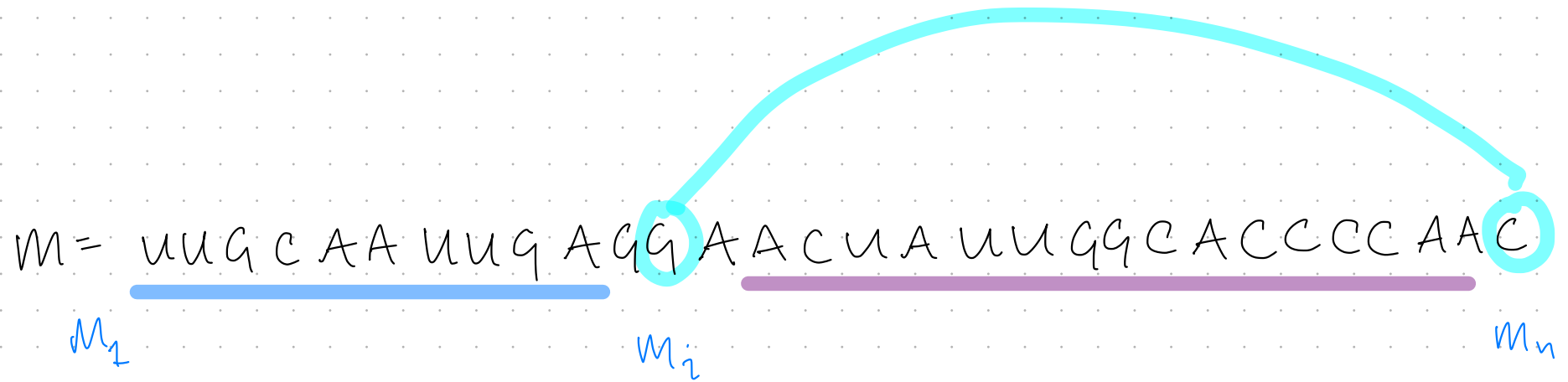


Best folding of substring from
left endpoint M_l to right endpoint M_r

= Fold(l, r)

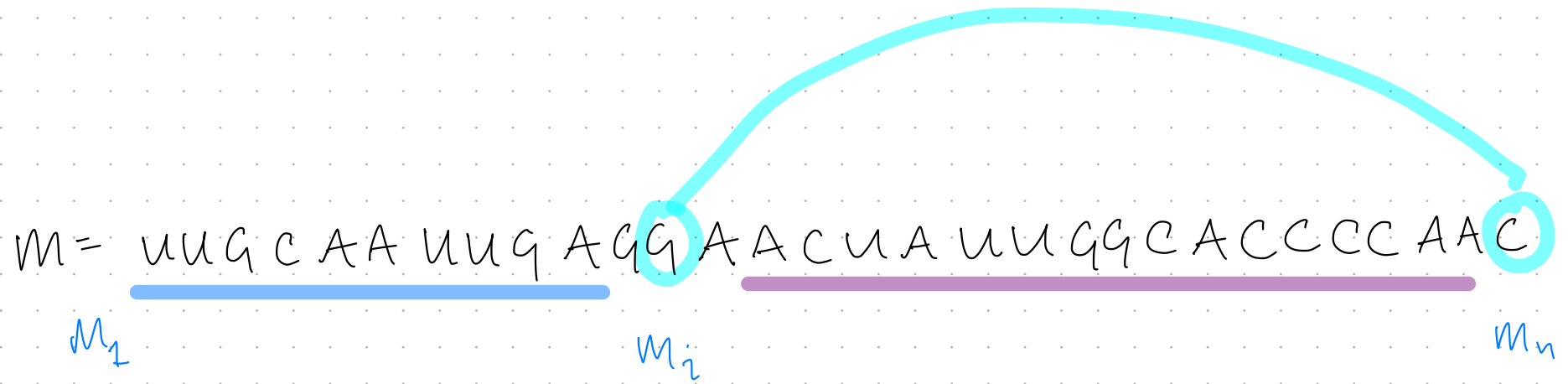
$\Rightarrow$ RNA Folding solved by Fold($1, n$)

Cases m_n base pairs w/ some m_i $i < n$



$$\text{Fold}(1, n) = \underline{1} + \underline{\text{Fold}(1, i-1)} + \underline{\text{Fold}(i+1, n-1)}$$

Cases m_n base pairs w/ some m_i $i < n$



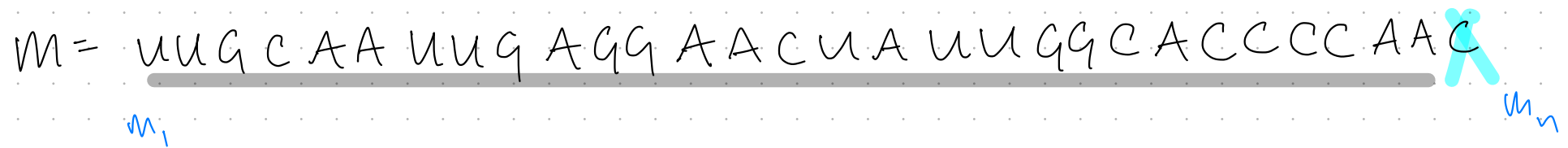
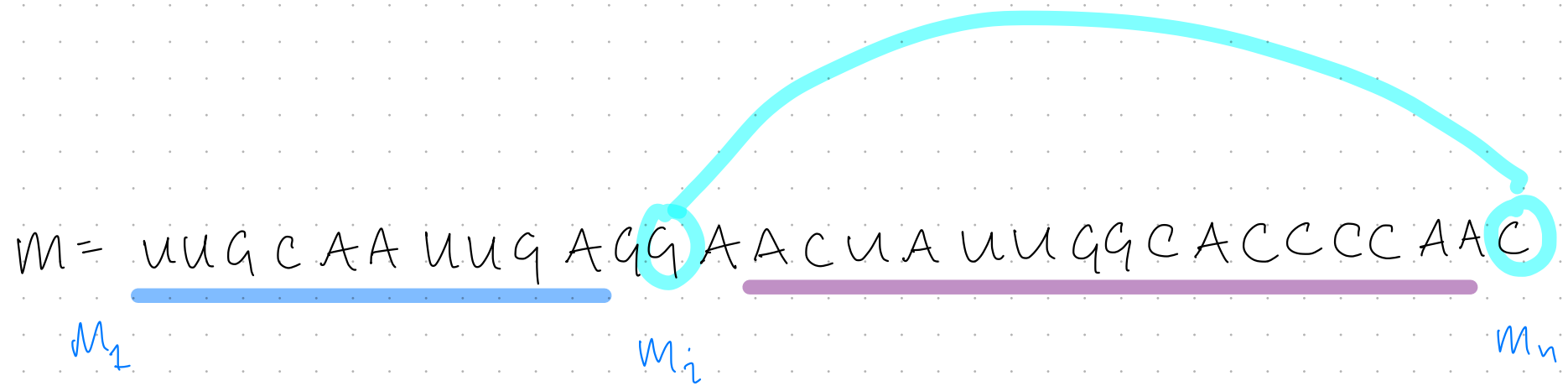
$$\text{Fold}(1, n) = \underline{1} + \underline{\text{Fold}(1, i-1)} + \underline{\text{Fold}(i+1, n-1)}$$

Note: subproblem does NOT start at $2=1$

Cases m_n does Not base pair

$M =$ UUGCAAUUGAGGAAUUAUUGGCACCCCAAC m_n

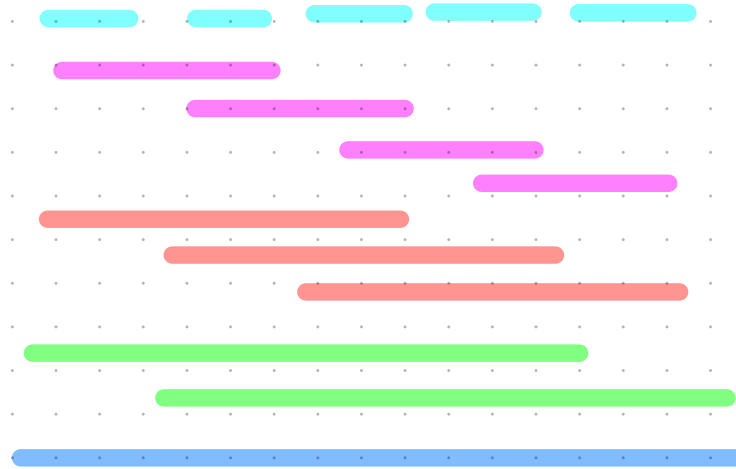
$$\text{Fold}(1, n) = \text{Fold}(1, n-1)$$



RNA Recurrence

$$\text{Fold}(1, n) = \max \left\{ \begin{array}{l} 1 + \max_{i \leq n} \left\{ \text{Fold}(1, i-1) + \text{Fold}(i+1, n) \right\} \\ \text{st. } (M_i, M_n) \in \text{EBP} \\ \text{Fold}(1, n-1) \end{array} \right.$$

M = A C A G U



Subproblems

* For each width 1, 2, 3, 4, 5

* For each left endpoint
A, C, A, G, U

A

AC

ACA

ACAG

ACAGU

C

CA

CAG

A

AG

G

A

AC

ACA

ACAG

ACAGU~~X~~



C

CA

CAG

A

AG

G

A

AC

ACA

ACAG

ACAGU

C

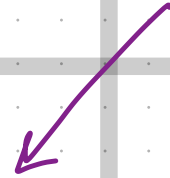
CA

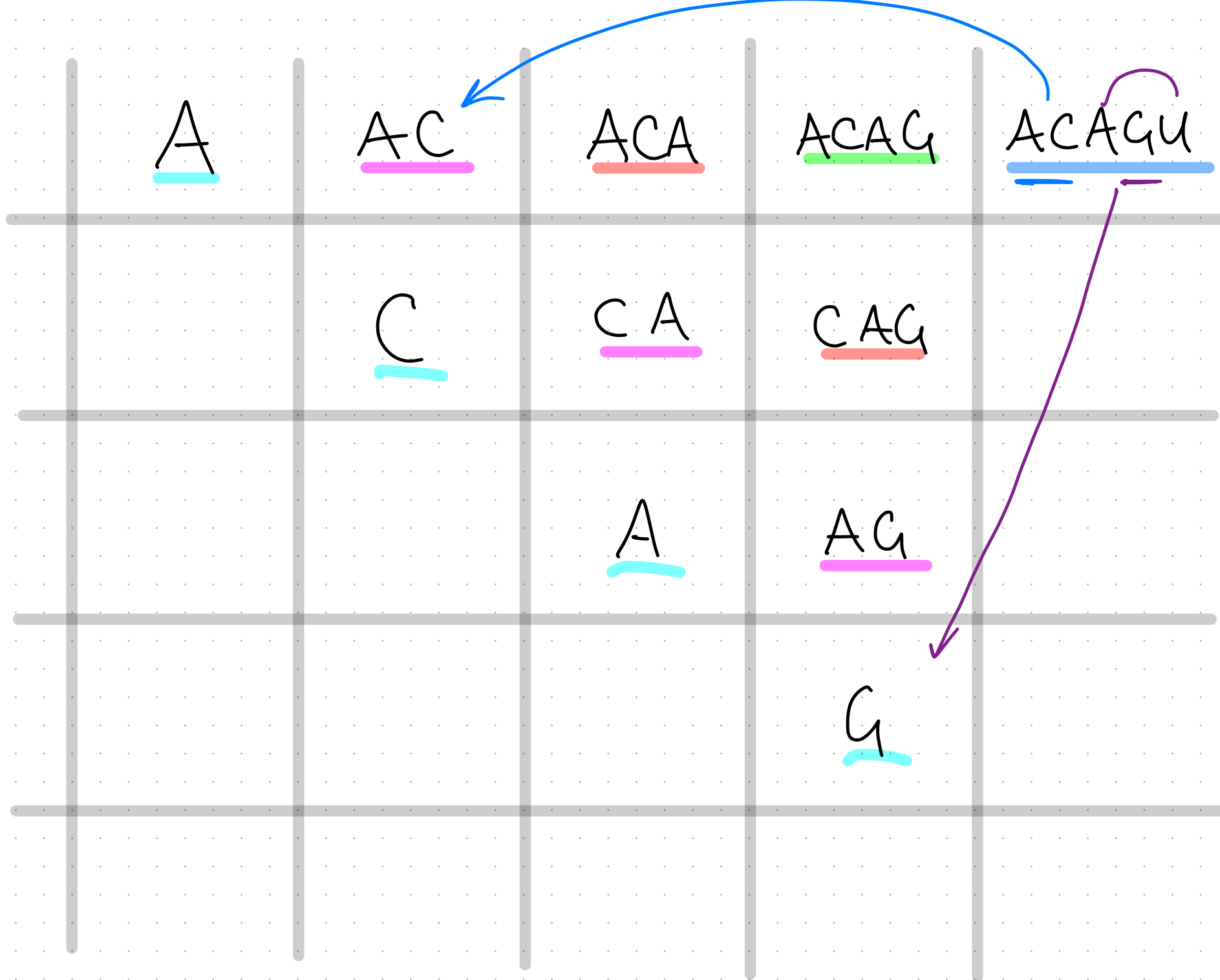
CAG

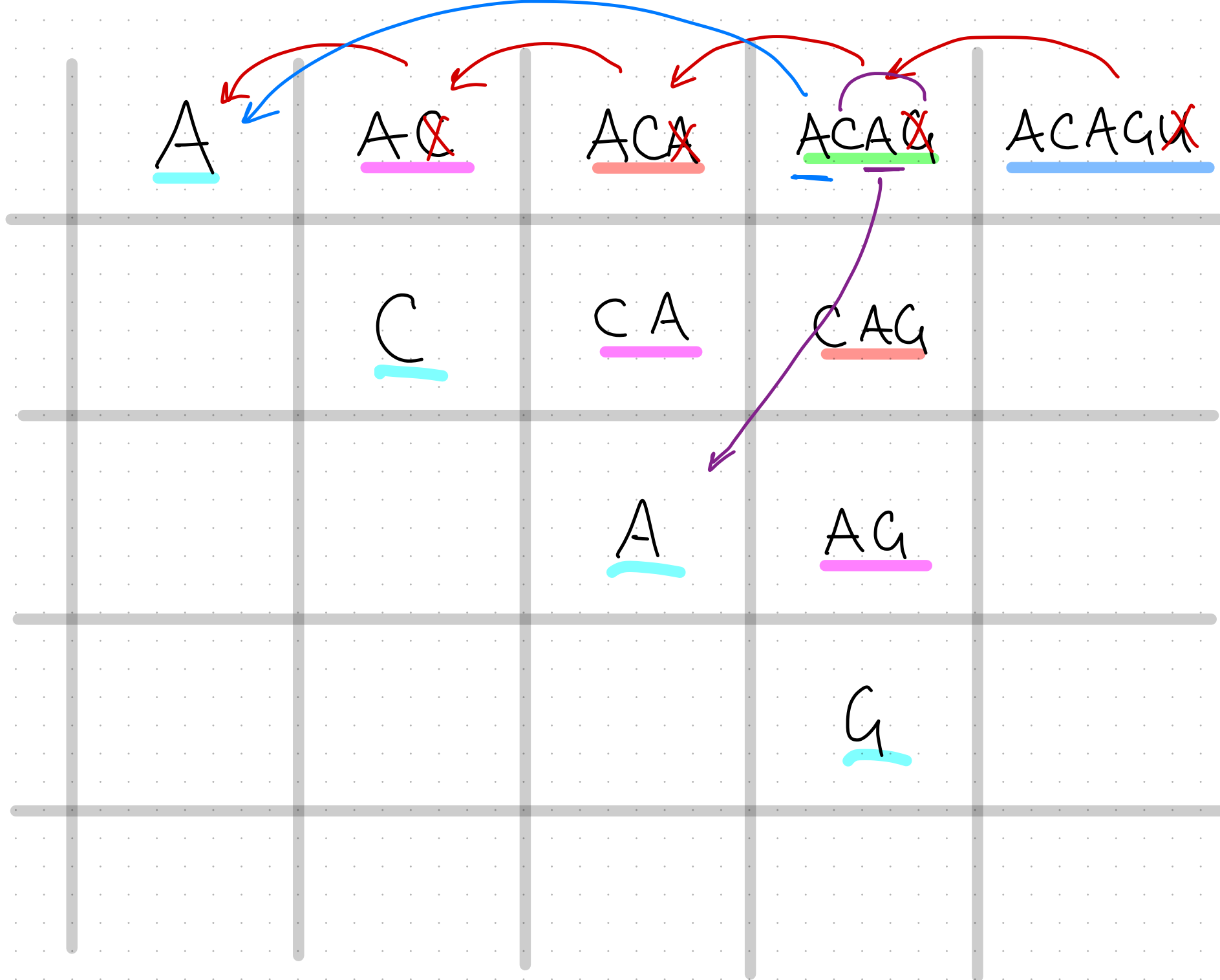
A

AG

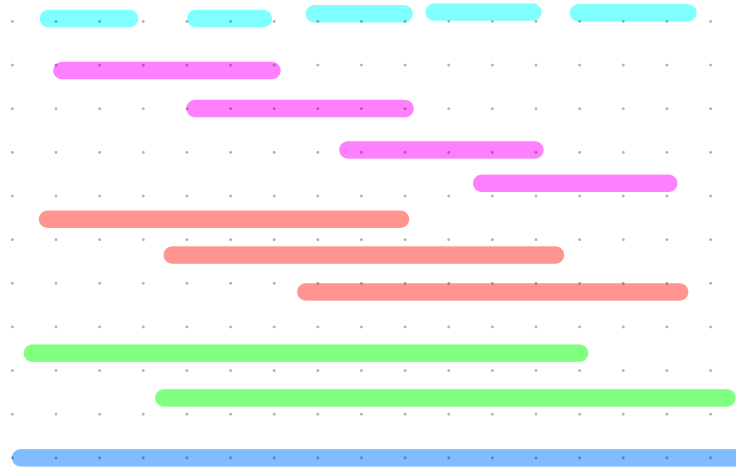
G







M = A C A G U



Subproblems

* For each width 1, 2, 3, 4, 5

* For each left endpoint

A, C, A, G, U

RNA-Fold(m).

For $l = 1 \rightarrow n$: $\text{Fold}(l, l) = 0$.

For width $= 1 \rightarrow n-1$

For $l = 1 \rightarrow n - \text{width}$

$r = l + \text{width}$

no Pair $\leftarrow \text{Fold}(l, r-1)$

best Pair $\leftarrow$

Find best legal base pair
between M_q and M_r
for some $l < q < r$

$$\text{Fold}(l, r) = \max \{ \text{no Pair}, \text{best Pair} \}$$

RNA-Fold(m).

For $l = 1 \rightarrow n$: $\text{Fold}(l, l) = 0$.

For width $= 1 \rightarrow n-1$

For $l = 1 \rightarrow n - \text{width}$

$r = l + \text{width}$

no Pair $\leftarrow \text{Fold}(l, r-1)$

best Pair $\leftarrow 0$

For $q = l \rightarrow r-1$

if $(M_q, M_r) \in \text{BP}$.

$q\text{Pair} \leftarrow 1 + \text{Fold}(l, q-1) + \text{Fold}(q+1, r-1)$

best Pair $\leftarrow \max \{ q\text{Pair}, \text{best Pair} \}$

$\text{Fold}(l, r) = \max \{ \text{no Pair}, \text{best Pair} \}$

A

Fold (1,1)

C

Fold (2,2)

A

Fold (3,3)

G

Fold (4,4)

A

Fold(1,1)

~~A~~

Fold(1,2)

C

Fold(2,2)

~~C~~

Fold(2,3)

A

Fold(3,3)

~~A~~

Fold(3,4)

G

Fold(4,4)

A

Fold(1,1)

AQ

Fold(1,2)

ACA

Fold(1,3)

C

Fold(2,2)

CA

Fold(2,3)

CAG

Fold(2,4)

A

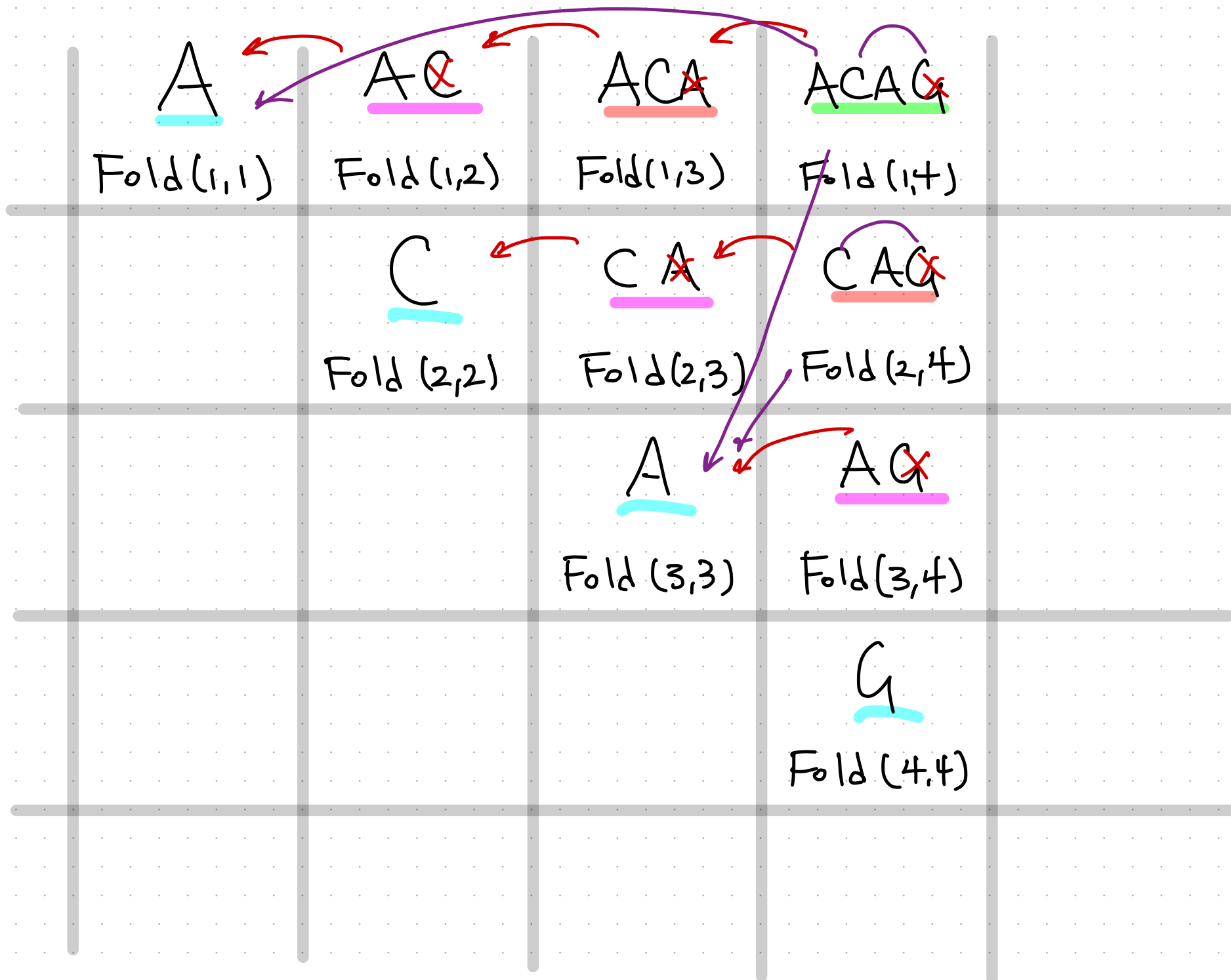
Fold(3,3)

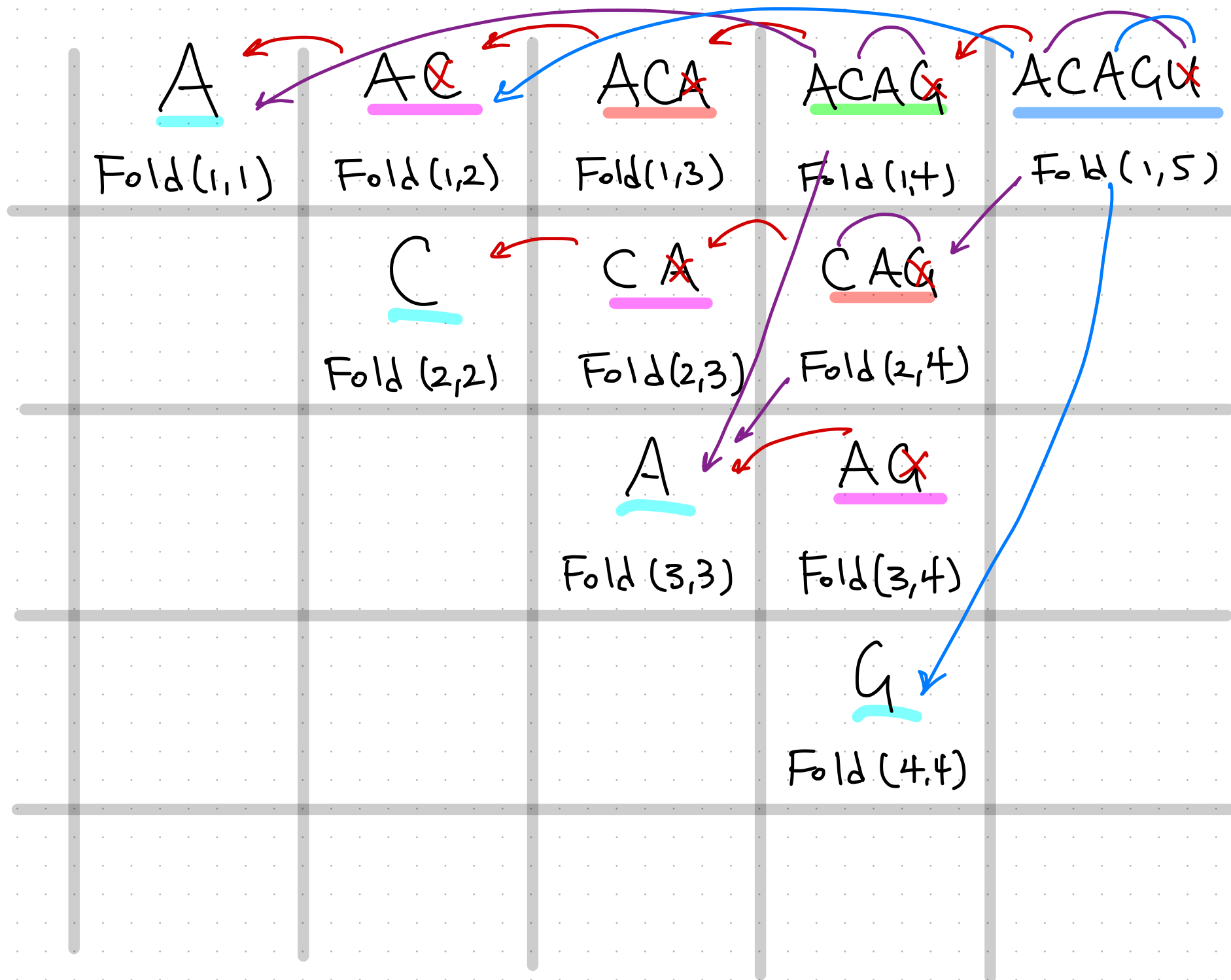
AQ

Fold(3,4)

G

Fold(4,4)





RNA-Fold(m).

For $l = 1 \rightarrow n$: $\text{Fold}(l, l) = 0$

For width $= 1 \rightarrow n-1$

For $l = 1 \rightarrow n - \text{width}$

$r = l + \text{width}$

no Pair $\leftarrow \text{Fold}(l, r-1)$

best Pair $\leftarrow 0$

For $q = l \rightarrow r-1$

if $(M_q, M_r) \in \text{BP}$

$q\text{Pair} \leftarrow 1 + \text{Fold}(l, q-1) + \text{Fold}(q+1, r-1)$

best Pair $\leftarrow \max \{ q\text{Pair}, \text{best Pair} \}$

$\text{Fold}(l, r) = \max \{ \text{no Pair}, \text{best Pair} \}$

Running Time

Entries for each
 $(l, r) \in [n] \times [n]$
 $\Rightarrow O(n^2)$

To fill in each
entry
 $\hookrightarrow$ Probe q s.t.
 $\underbrace{l < q < r}_{O(n)}$

Total
 $\Rightarrow O(n^3)$

Proof of Correctness.

For all $n \in \mathbb{N}$, $\text{Fold}(1, n)$ returns max non-crossing match.

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For all widths $w \in \mathbb{N}$, for all left endpoints $l \leq |M| - w$

$\text{Fold}(l, l+w) = \max$ non-crossing match
w/ left endpoint M_l
and right endpoint M_{l+w} .

Proof of Correctness.

For all $n \in \mathbb{N}$, $\text{Fold}(1, n)$ returns max non-crossing match.



For all widths $w \in \mathbb{N}$, for all left endpoints $l \leq |M| - w$

$$\text{Fold}(l, l+w) = \max \begin{array}{l} \text{non-crossing match} \\ \text{w/ left endpoint } M_l \\ \text{and right endpoint } M_{l+w} \end{array}$$

Base case. $w=0$.

* No base pairing possible w/ single character

$$\Rightarrow \max \text{ match} = 0 \\ \text{for all } l.$$

* $\text{Fold}(l, l) = 0$



Inductive Hypothesis . $\forall w_0 < w$, for all legal l

$\text{Fold}(l, l+w_0) = \text{best RNA fold from } M_l \text{ to } M_{l+w_0}$

Consider $M_l M_{l+1} M_{l+2} \dots M_{l+w-1} M_{l+w}$.

Two cases.

* M_{l+w} not paired :

Best fold from $M_l \rightarrow M_{l+w}$

= Best fold from $M_l \rightarrow M_{l+w-1}$) By IH

= $\text{Fold}(l, l+w-1)$

↓
width $w-1 < w$

Inductive Hypothesis. $\forall w_0 < w$, for all legal l

$\text{Fold}(l, l+w_0) = \text{best RNA fold from } M_l \text{ to } M_{l+w_0}$

Consider $M_l \ M_{l+1} \ M_{l+2} \dots M_{l+w-1} \ M_{l+w}$.

Two cases. M_{l+w} paired:

Best fold from $M_l \rightarrow M_{l+w}$

$= \text{Best } q \text{ BP}(M_q, M_r) +$

Best fold from $M_l \rightarrow M_{q-1} + \text{Best fold from } M_{q+1} \rightarrow M_{l+w-1}$

Inductive Hypothesis. $\forall w_0 < w$, for all legal l

$\text{Fold}(l, l+w_0) = \text{best RNA fold from } M_l \text{ to } M_{l+w_0}$

Consider $M_l M_{l+1} M_{l+2} \dots M_{l+w-1} M_{l+w}$.

Two cases. M_{l+w} paired:

Best fold from $M_l \rightarrow M_{l+w}$

$= \text{Best } q \text{ BP}(M_q, M_r) +$

Best fold from $M_l \rightarrow M_{q-1}$ + Best fold from $M_{q+1} \rightarrow M_{l+w-1}$

Both of width $w' < w$.

Inductive Hypothesis. $\forall w_0 < w$, for all legal l

$\text{Fold}(l, l+w_0) = \text{best RNA fold from } M_l \text{ to } M_{l+w_0}$

Consider $M_l \ M_{l+1} \ M_{l+2} \dots M_{l+w-1} \ M_{l+w}$.

Two cases. M_{l+w} paired:

Best fold from $M_l \rightarrow M_{l+w}$

$= \text{Best } q \text{ BP}(M_q, M_r) +$

Best fold from $M_l \rightarrow M_{q-1} + \text{Best fold from } M_{q+1} \rightarrow M_{l+w-1}$

Both of width $w' < w$.

$= 1 + \text{Fold}(l, q-1) + \text{Fold}(q+1, l+w-1)$

By IH

□