

Dinamičko programiranje

Problem ranca

Problem ranca

- Provalnik ima ranac zapremine **N**. Pljačka prostoriju u kojoj se nalazi **M** različitih vrsta vrednosnih predmeta.
- Za svaki predmet je data njegova vrednost **vred[i]** i njegova zapremina **zapr[i]**, $i=1,\dots,M$. Broj primeraka svake vrste predmeta je neograničen.
- Potrebno je popuniti ranac predmetima tako da vrednost predmeta u rancu bude najveća moguća.

Korak 1 – struktura rešenja

- Potproblemi – rančevi različitih zapremine
- $pred_1, pred_2, \dots, pred_i, \dots, pred_m$
- $ranac_1, ranac_2, \dots, ranac_j, \dots, ranac_n$
- Ako stavimo predmet i u ranac zapremine j , dodajemo njegovu vrednost na optimalno popunjen ranac zapremine j – $zapr_i$
- Biramo predmet koji daje najveću vrednost popunjenog ranca j .

Korak 2 - rekurzija

- $opt(j) = \max(vred_i + opt(j - zapr_i))$
 - $1 \leq i \leq m$
 - $zapr_i \leq j$
- $opt(0) = 0$

Korak 3 – bottom-up

• $N = 7$; $M = 3$;

$opt[0] = 0$;

Zapr

4	3	5
---	---	---

Vred

4	3	8
1	2	3

Opt

0							
---	--	--	--	--	--	--	--

Pred

0							
0	1	2	3	4	5	6	7

Korak 3 – bottom-up

- $N = 7$; $M = 3$;

Zapr	4	3	5
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Vred	4	3	8
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```
opt[0] = 0;  
for j = 1,n  
    opt[j] = 0;  
    for i = 1,m  
        if (zapr[i] <= j)  
            ...
```

Opt	0						
-----	---	--	--	--	--	--	--

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Pred	0	0	0					
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```

Opt	0	0	0	3				
-----	---	---	---	---	--	--	--	--

Pred	0	0	0	2				
	0	1	2	3	4	5	6	7

Korak 3 – bottom-up

- $N = 7$; $M = 3$;

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Opt	0	0	0	3	4			
-----	---	---	---	---	---	--	--	--

Pred	0	0	0	2	1			
	0	1	2	3	4	5	6	7

Korak 3 – bottom-up

- $N = 7$; $M = 3$;

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Opt	0	0	0	3	4	8	8	8
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Opt	0	0	0	3	4	8	8	8
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Pred	0	0	0	2	1	3	3	3
	0	1	2	3	4	5	6	7

← optimalno rešenje,
maksimalna
vrednost u rancu

Korak 4 – rekonstrukcija

- $N = 7$; $M = 3$;

Zapr

4	3	5
---	---	---

Vred

4	3	8
1	2	3

Opt

0	0	0	3	4	8	8	8
---	---	---	---	---	---	---	---

Pred

0	0	0	2	1	3	3	3
0	1	2	3	4	5	6	7

```
i = n;  
while (pred[i]>0)  
    print(pred[i]);  
    i -= zapr[pred[i]];
```

Korak 4 – rekonstrukcija

- $N = 7$; $M = 3$;

Zapr

4	3	5
---	---	---

Vred

4	3	8
---	---	---

1 2 3

Opt

0	0	0	3	4	8	8	8
---	---	---	---	---	---	---	---

Pred

0	0	0	2	1	3	3	3
---	---	---	---	---	---	---	---

0 1 2 3 4 5 6 7

```
i = n;  
while (pred[i]>0)  
    print(pred[i]);  
    i -= zapr[pred[i]];
```

Korak 4 – rekonstrukcija

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Zapr	4	3	5
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Vred	4	3	8
	1	2	3

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Pred	0	0	0	2	1	3	3	3
	0	1	2	3	4	5	6	7

```
i = n;  
while (pred[i]>0)  
    print(pred[i]);  
    i -= zapr[pred[i]];
```

Predmeti u rancu:

3

Test primer 2

- $N = 7$; $M = 3$;

Zapr	4	3	5
------	---	---	---

Vred	4	3	6
	1	2	3

```
opt[0] = 0;
for j = 1,n
    opt[j] = 0;
    for i = 1,m
        if (zapr[i] <= j)
            opt[j] = max(opt[j],
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Opt	0						
-----	---	--	--	--	--	--	--

Pred	0							
	0	1	2	3	4	5	6	7

Test primer 2

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Opt	0	0	0	3	4	6	6	7
-----	---	---	---	---	---	---	---	---

Pred	0	0	0	2	1	3	2	1
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Test primer 2

- $N = 7$; $M = 3$;

Zapr	4	3	5
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Vred	4	3	6
	1	2	3

Opt	0	0	0	3	4	6	6	7
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Pred	0	0	0	2	1	3	2	1
	0	1	2	3	4	5	6	7

```
while (pred[i]>0)
    print(pred[i]);
    i -= zapr[pred[i]];
```

Predmeti u rancu:

1, 2

Problem ranca – varijanta II

- Od svake vrste predmeta postoji po jedan primerak.
 - Dimenzije problema – zapremina i predmeti
 - Potproblem (i, j)
 - Iskorišćeni predmeti do i
 - Popunjena zapremina do j
1. Dodajemo predmet i
 - na zapreminu $j - zapr_i$
 - popunjenu predmetima od 1 do $i - 1$
 2. Ne dodajemo predmet i
 - Zadržavamo optimalno $(i - 1, j)$

Problem ranca – varijanta II

- $opt(i, j) = \max \left(\begin{array}{c} vred_i + opt(i - 1, j - zapr_i), \\ opt(i - 1, j) \end{array} \right)$
 - $zapr_i \leq j$
- $opt(0, j) = 0$
- $opt(i, 0) = 0$

Problem ranca – varijanta II

- $N = 7$; $M = 3$;

Zapr	3	4	5
------	---	---	---

Vred	3	4	6
	1	2	3

Opt

0	0	0	0	0	0	0	0	0
1	0							
2	0							
3	0							
	0	1	2	3	4	5	6	7

```
for i = 1,m
  for j = 1,n
    if (zapr[i]<=j)
      opt[i][j] = max(opt[i-1][j-zapr[i]]+vred[i],
                      opt[i-1][j])
    else
      opt[i][j] = opt[i-1][j];
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Problem ranca – varijanta II

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Zapr	3	4	5
------	---	---	---

Vred	3	4	6
	1	2	3

Opt

0	0	0	0	0	0	0	0	0
1	0	0	0	3	3	3	3	3
2	0	0	0	3	4	4	4	7
3	0	0	0	3	4	6	6	7
	0	1	2	3	4	5	6	7

```
for i = 1,m
  for j = 1,n
    if (zapr[i]<=j)
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optimalno rešenje,
maksimalna
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Vred	3	4	6
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Opt

0	0	0	0	0	0	0	0	0
1	0	0	0	3	3	3	3	3
2	0	0	0	3	4	4	4	7
3	0	0	0	3	4	6	6	7
	0	1	2	3	4	5	6	7

```
i=m; j=n;
while (opt[i][j]!=0)
    if (opt[i][j] == opt[i-1][j])
        i--;
    else
        print(i);
        j -= zapr[i];
        i--;
```

Problem ranca – varijanta II

- $N = 7$; $M = 3$;

Zapr	3	4	5
------	---	---	---

Vred	3	4	6
	1	2	3

Opt

0	0	0	0	0	0	0	0
1	0	0	0	3	3	3	3
2	0	0	0	3	4	4	4
3	0	0	0	3	4	6	6
	0	1	2	3	4	5	6

```
i=m; j=n;
while (opt[i][j]!=0)
    if (opt[i][j] == opt[i-1][j])
        i--;
    else
        print(i);
        j -= zapr[i];
        i--;
```

Predmeti u rancu:

1, 2