# **Complementary Slackness**

#### Lemma 2

Assume a linear program  $P = \max\{c^Tx \mid Ax \le b; x \ge 0\}$  has solution  $x^*$  and its dual  $D = \min\{b^Ty \mid A^Ty \ge c; y \ge 0\}$  has solution  $y^*$ .

- **1.** If  $x_i^* > 0$  then the *j*-th constraint in *D* is tight.
- **2.** If the *j*-th constraint in *D* is not tight than  $x_i^* = 0$ .
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Brewer: find mix of ale and beer that maximizes profits

Entrepeneur: buy resources from brewer at minimum cost C, H, M: unit price for corn, hops and malt.

min 
$$480C$$
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s.t.  $5C$  +  $4H$  +  $35M$  ≥  $13$   
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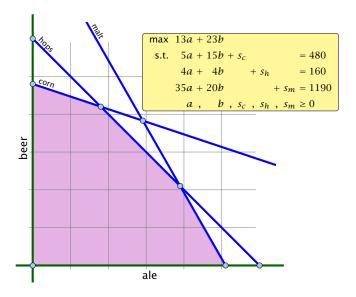
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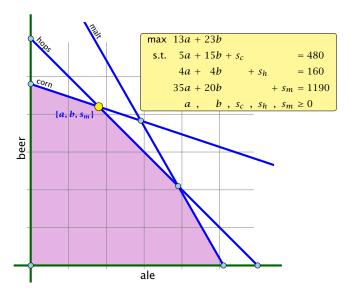


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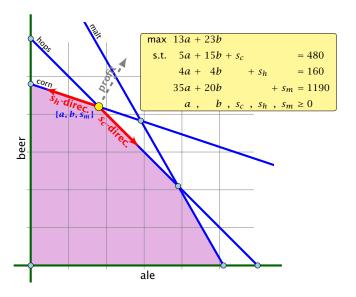


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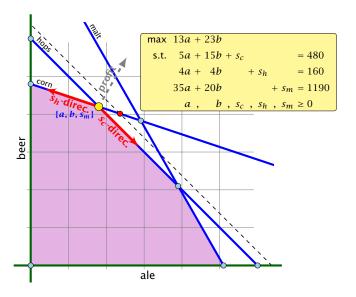


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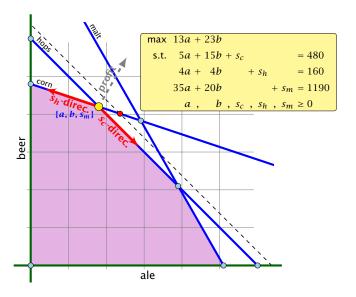


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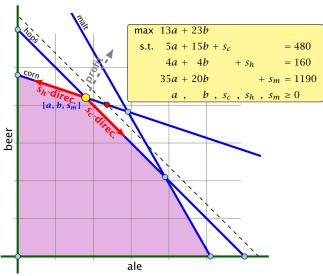


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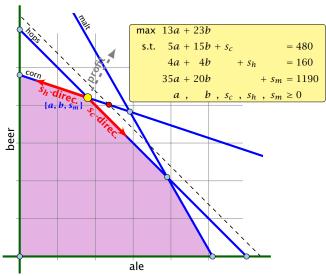
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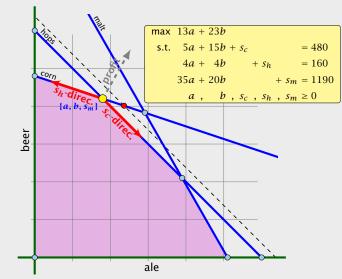
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Of course, the previous argument about the increase in the primal objective only holds for the non-degenerate case.

If the optimum basis is degenerate then increasing the supply of one resource may not allow the objective value to increase.

# Example



The change in profit when increasing hops by one unit is

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